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(54) **APPARATUS AND METHOD FOR COMBINED INTRABAND AND INTERBAND MULTI-FRAME DEMOSAICING**

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Related U.S. Application Data

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(51) **Int. Cl.**
G06T 5/50 (2006.01)
G06T 5/70 (2024.01)
(Continued)

(52) **U.S. Cl.**
CPC ***G06T 5/50*** (2013.01); ***G06T 5/70*** (2024.01); ***G06T 5/73*** (2024.01); ***G06T 7/269*** (2017.01);
(Continued)

(58) **Field of Classification Search**
CPC ... G06T 5/70; G06T 2207/20221; G06T 5/50; G06T 2207/10024; G06T 5/73; G06T 7/90; G06T 7/269
See application file for complete search history.

(56) **References Cited**

U.S. PATENT DOCUMENTS

8,108,211 B2 * 1/2012 Baqai G01V 1/28 704/214
8,253,832 B2 8/2012 Adams, Jr. et al.
(Continued)

FOREIGN PATENT DOCUMENTS

JP 2020-123864 A 8/2020
JP 2020-187611 A 11/2020
(Continued)

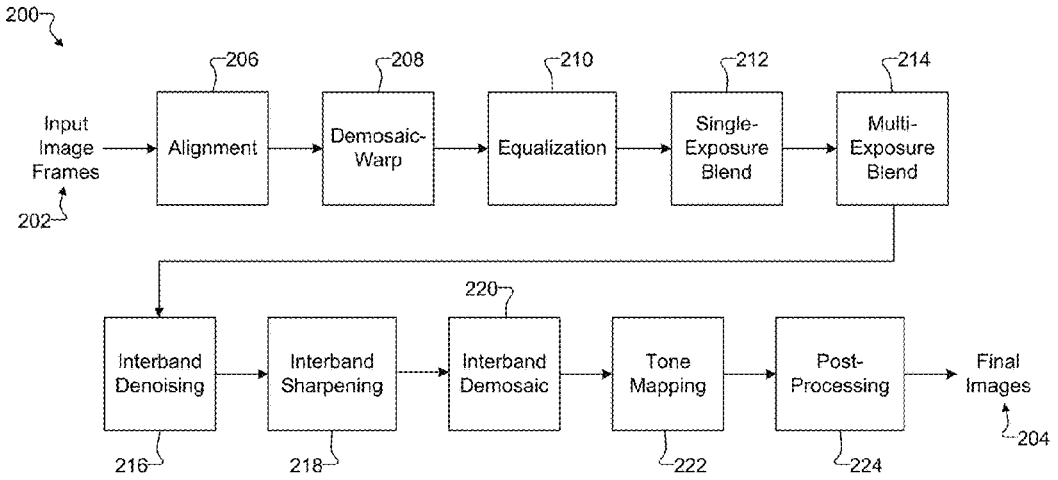
OTHER PUBLICATIONS

International Search Report and Written Opinion of the International Searching Authority dated Oct. 7, 2022 in connection with International Patent Application No. PCT/KR2022/009080, 10 pages.
(Continued)

Primary Examiner — Margaret G Mastrodonato

(57) **ABSTRACT**

A method includes obtaining multiple input image frames and determining how to warp at least one of the input image frames. The method also includes performing an intraband demosaic-warp operation to reconstruct image data in different color channels of the input image frames and warp the at least one input image frame to produce RGB input image frames. The method further includes blending the RGB input image frames to produce a blended RGB image frame, performing an interband denoising operation to produce a denoised RGB image frame, and performing an interband sharpening operation to produce a sharpened RGB image frame. In addition, the method includes performing an interband demosaic operation to substantially equalize high-frequency content in different color channels of the sharp-
(Continued)



ened RGB image frame to produce an equalized sharpened RGB image frame and generating a final image of the scene based on the equalized sharpened RGB image frame.

30 Claims, 15 Drawing Sheets

(51) **Int. Cl.**
G06T 5/73 (2024.01)
G06T 7/269 (2017.01)
G06T 7/90 (2017.01)

(52) **U.S. Cl.**
CPC ***G06T 7/90*** (2017.01); *G06T 2207/20221* (2013.01)

(56) **References Cited**

U.S. PATENT DOCUMENTS

8,638,342	B2	1/2014	Cote et al.	
8,644,640	B2	2/2014	Demandolx	
8,718,361	B2	5/2014	Moon et al.	
8,724,895	B2	5/2014	Lin et al.	
9,094,565	B2	7/2015	Wang et al.	
9,140,608	B2	9/2015	Kim et al.	
9,185,376	B2	11/2015	Tai et al.	
9,672,599	B2	6/2017	Kim et al.	
9,979,942	B2	5/2018	Lim et al.	
10,097,765	B2	10/2018	Sheikh et al.	
10,638,060	B2	4/2020	Liu et al.	
10,853,913	B2	12/2020	Chuang et al.	
10,902,558	B2	1/2021	Ferres et al.	
11,062,436	B2	7/2021	Pekkucuksen et al.	
2009/0285480	A1	11/2009	Bennett et al.	
2011/0050918	A1	3/2011	Tachi	
2014/0118582	A1	5/2014	Artyomov et al.	
2015/0363913	A1	12/2015	Higgins	
2016/0277721	A1*	9/2016	Roffet	H04N 9/646
2017/0163951	A1	6/2017	Getman et al.	
2018/0025478	A1	1/2018	Lee et al.	
2018/0197277	A1	7/2018	Shi et al.	
2019/0378258	A1	12/2019	Fan et al.	
2020/0396398	A1*	12/2020	Romanenko	H04N 5/21
2021/0019530	A1	1/2021	Tang et al.	
2022/0335663	A1	10/2022	Hill et al.	

FOREIGN PATENT DOCUMENTS

JP	2021082211	A	5/2021
KR	10-2014-0055503	A	5/2014
KR	10-1703354	B1	2/2017
KR	10-2055411	B1	12/2019
WO	2021/058347	A1	4/2021

OTHER PUBLICATIONS

International Search Report and Written Opinion of the International Searching Authority dated Oct. 17, 2022 in connection with International Patent Application No. PCT/KR2022/010326, 9 pages.
Wronski et al., "Handheld Multi-Frame Super-Resolution", ACM Trans. Graph, vol. 38, No. 4, Jul. 2019, 24 pages.
Barnes, "Image Filtering, Warping and Sampling", 147 pages, 2016.
Glotzbach et al., "A Method of Color Filter Array Interpolation with Alias Cancellation Properties", IEEE, 2001, 4 pages.
He et al., "Guided Image Filtering", IEEE Transactions on Pattern Analysis and Machine Intelligence, Oct. 2012, 14 pages.
Jee et al., "Sensitivity and Resolution Improvement in RGBW Color Filter Array Sensor", Sensors, May 2018, 18 pages.
Wikipedia, "Bayer filter", en.wikipedia.org, May 2021, 13 pages.
Non-Final Office Action dated Jun. 21, 2024 in connection with U.S. Appl. No. 17/586,435, 28 pages.
Supplementary European Search Report dated May 23, 2024 in connection with European Patent Application No. 22842498.2, 43 pages.
Karch et al., "Robust super-resolution by fusion of interpolated frames for color and grayscale images," Frontiers in Physics, Apr. 2015, 14 pages.
Farsiu et al., "Video-to-Video Dynamic Super-Resolution for Grayscale and Color Sequences," EURASIP Journal on Applied Signal Processing, vol. 2006, Article ID 61859, 2006, 15 pages.
Wu et al., "Joint Spatial-Temporal Color Demosaicking," SCIA 2005, LNCS 3540, Jun. 2005 18 pages.

* cited by examiner

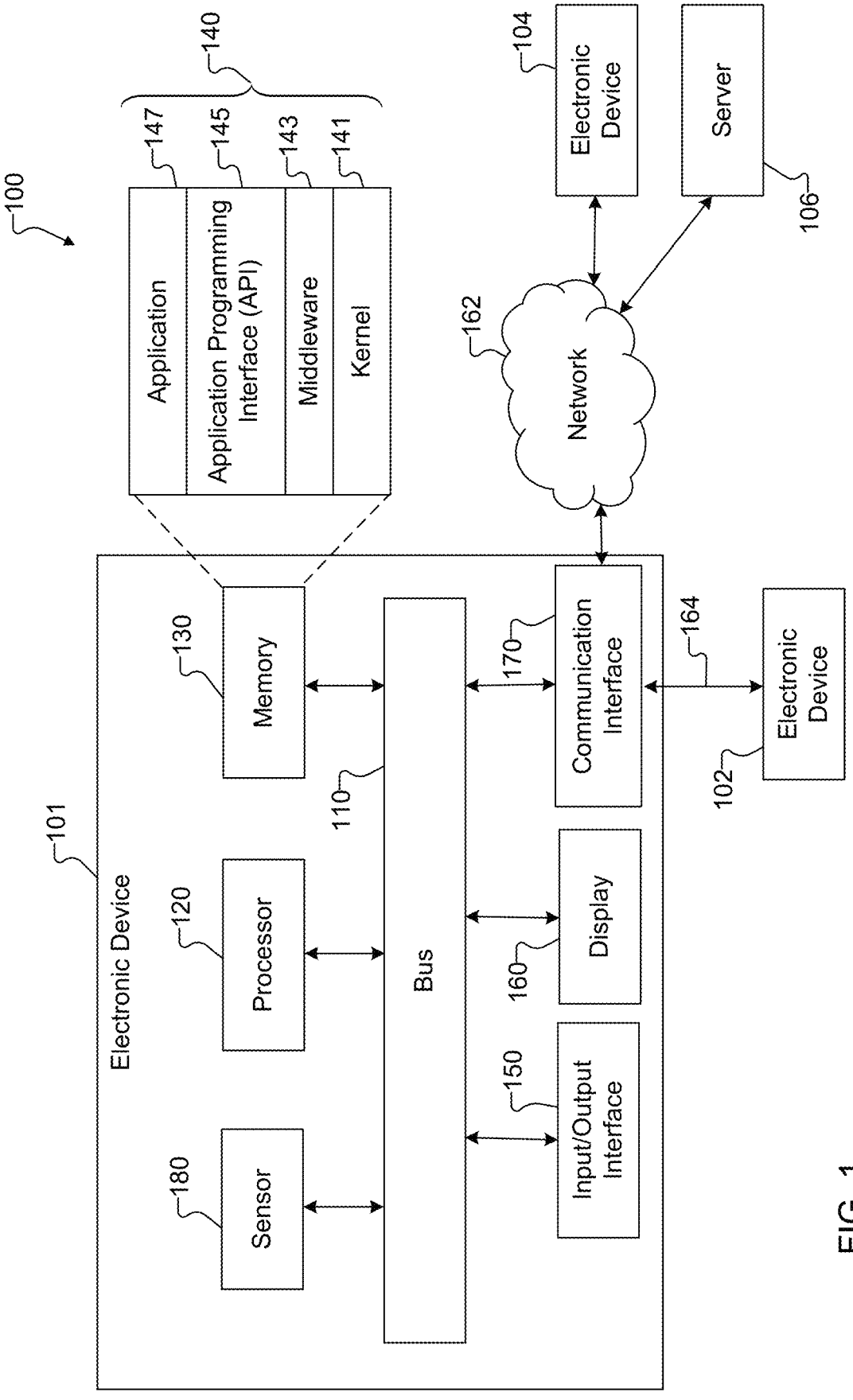

100
140
147
145
143
141
Application
Application Programming Interface (API)
Middleware
Kernel
104
Electronic Device
Server
106
162
Network
101
Electronic Device
130
Memory
110
Bus
170
Communication Interface
164
Electronic Device
102
120
Processor
160
Display
150
Input/Output Interface
180
Sensor

FIG. 1

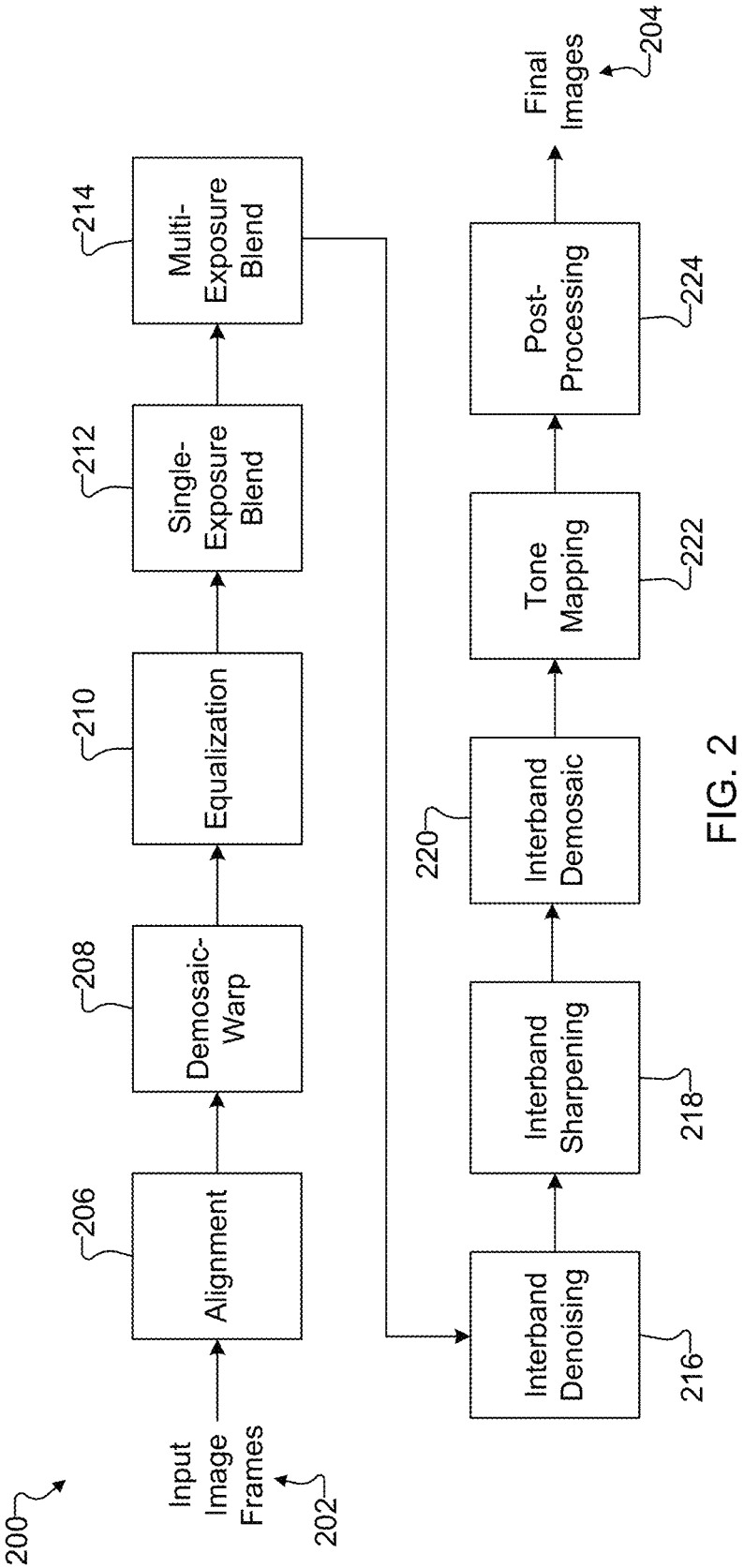

200
Input Image Frames
202
Alignment
206
Demosaic-Warp
208
Equalization
210
Single-Exposure Blend
212
Multi-Exposure Blend
214
Interband Denoising
216
Interband Sharpening
218
Interband Demosaic
220
Tone Mapping
222
Post-Processing
224
Final Images
204

FIG. 2

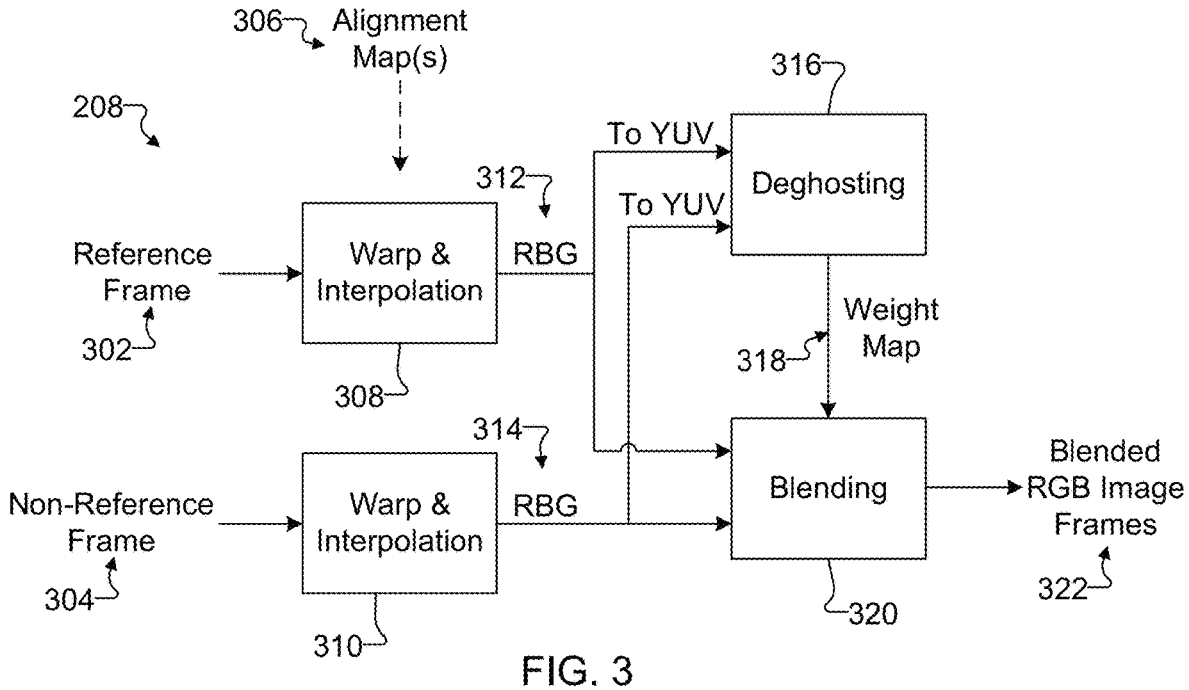

306
Alignment Map(s)
208
316
To YUV
Deghosting
312
To YUV
Reference Frame
302
Warp & Interpolation
RBG
308
Weight Map
318
314
Blending
Blended RGB Image Frames
322
Non-Reference Frame
304
Warp & Interpolation
RBG
310
320

FIG. 3

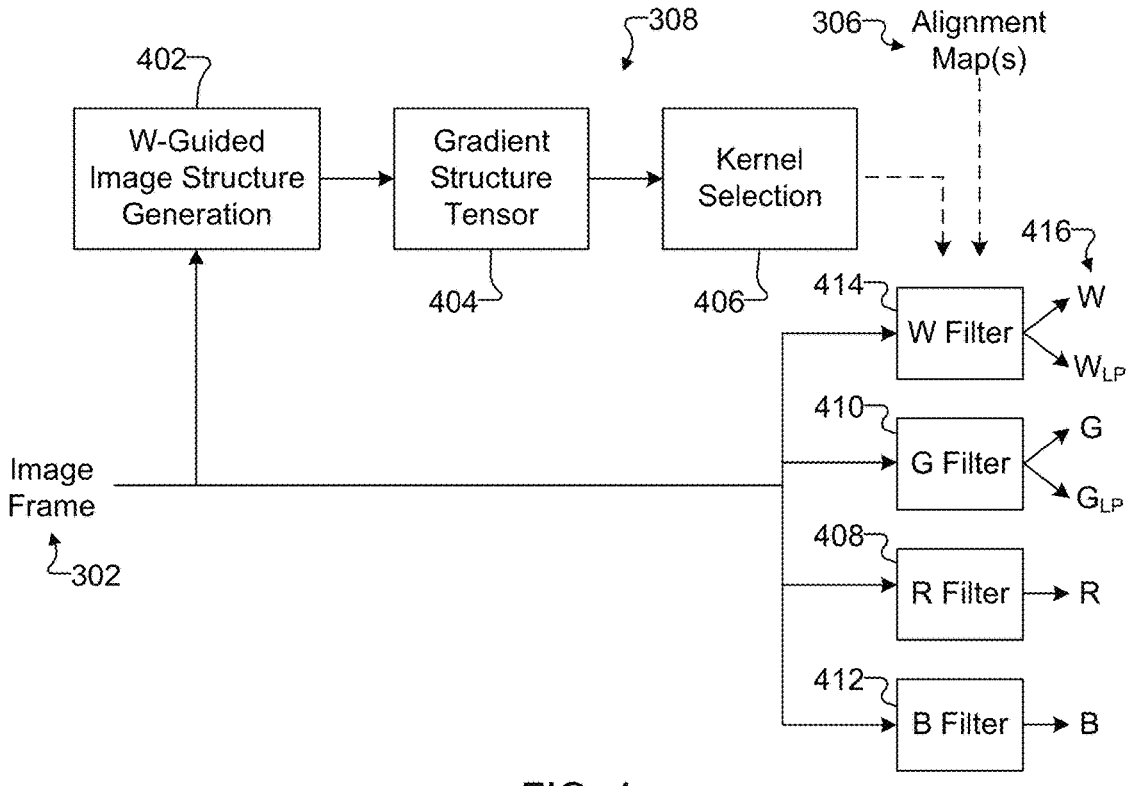

308
306
Alignment Map(s)
402
W-Guided Image Structure Generation
Gradient Structure Tensor
Kernel Selection
416
404
406
414
W Filter
W
W_{LP}
410
G Filter
G
G_{LP}
Image Frame
302
408
R Filter
R
412
B Filter
B

FIG. 4

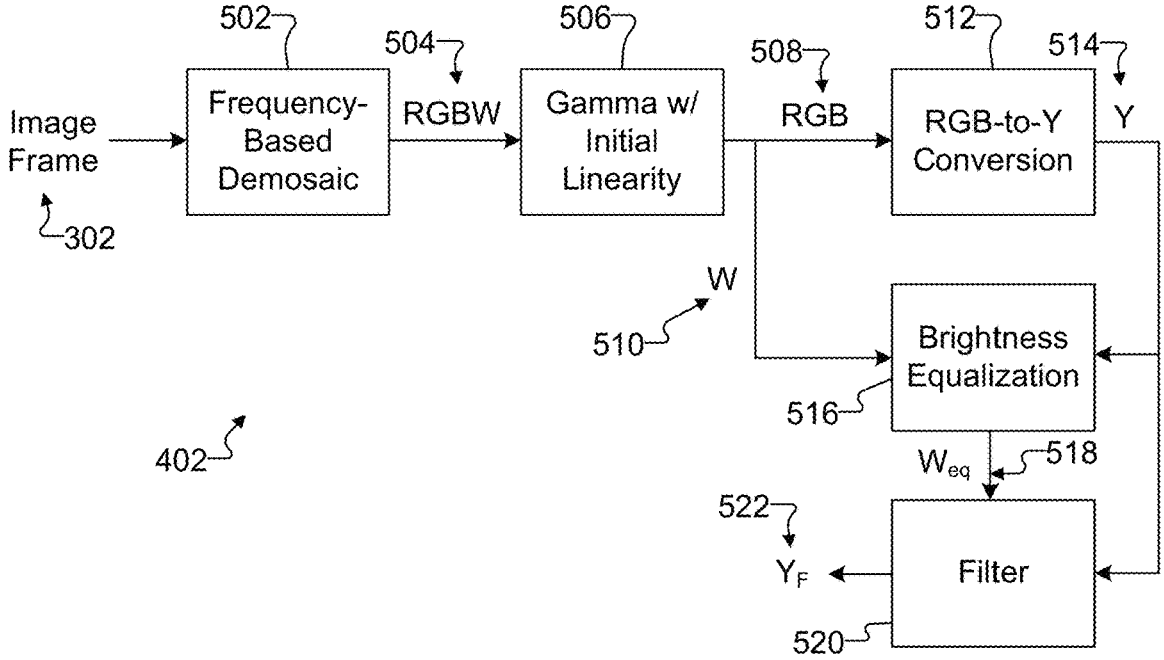


Image Frame
302
Frequency-Based Demosaic
502
RGBW
504
Gamma w/ Initial Linearity
506
RGB
508
RGB-to-Y Conversion
512
Y
514
W
510
Brightness Equalization
516
W_{eq}
518
Filter
522
Y_F
520
402

FIG. 5

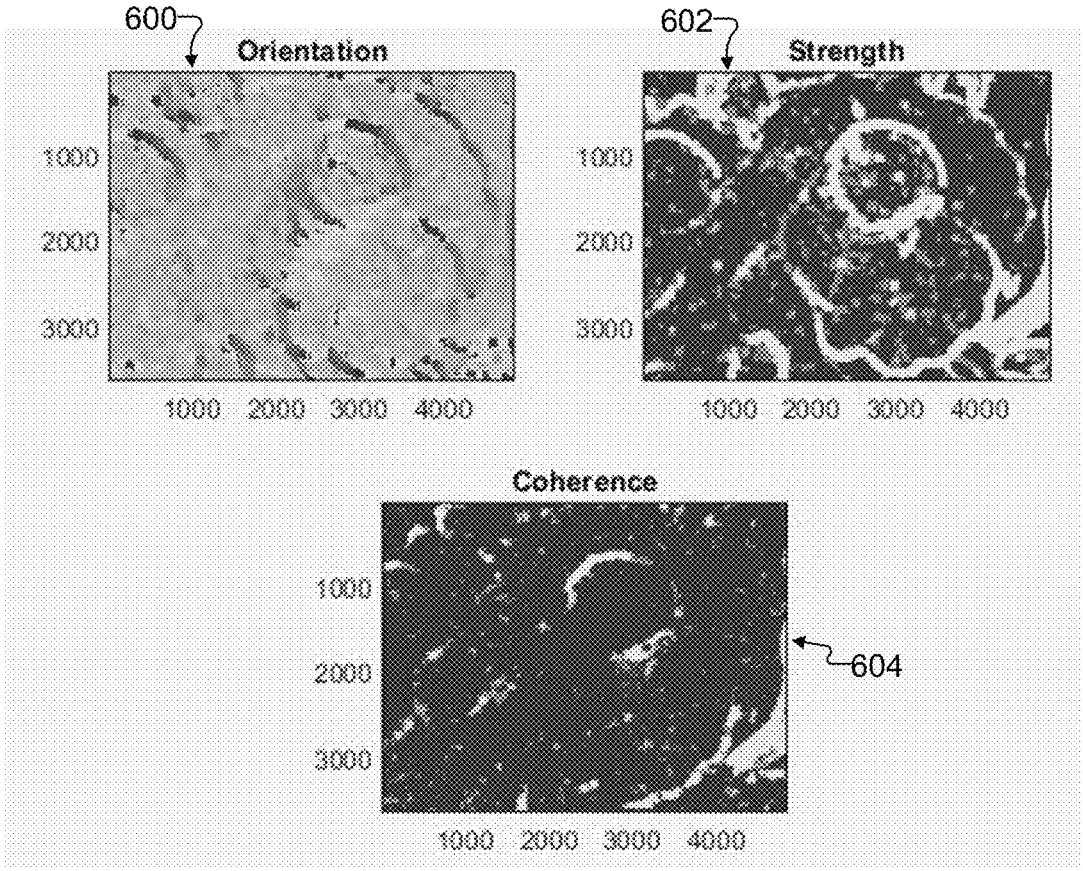
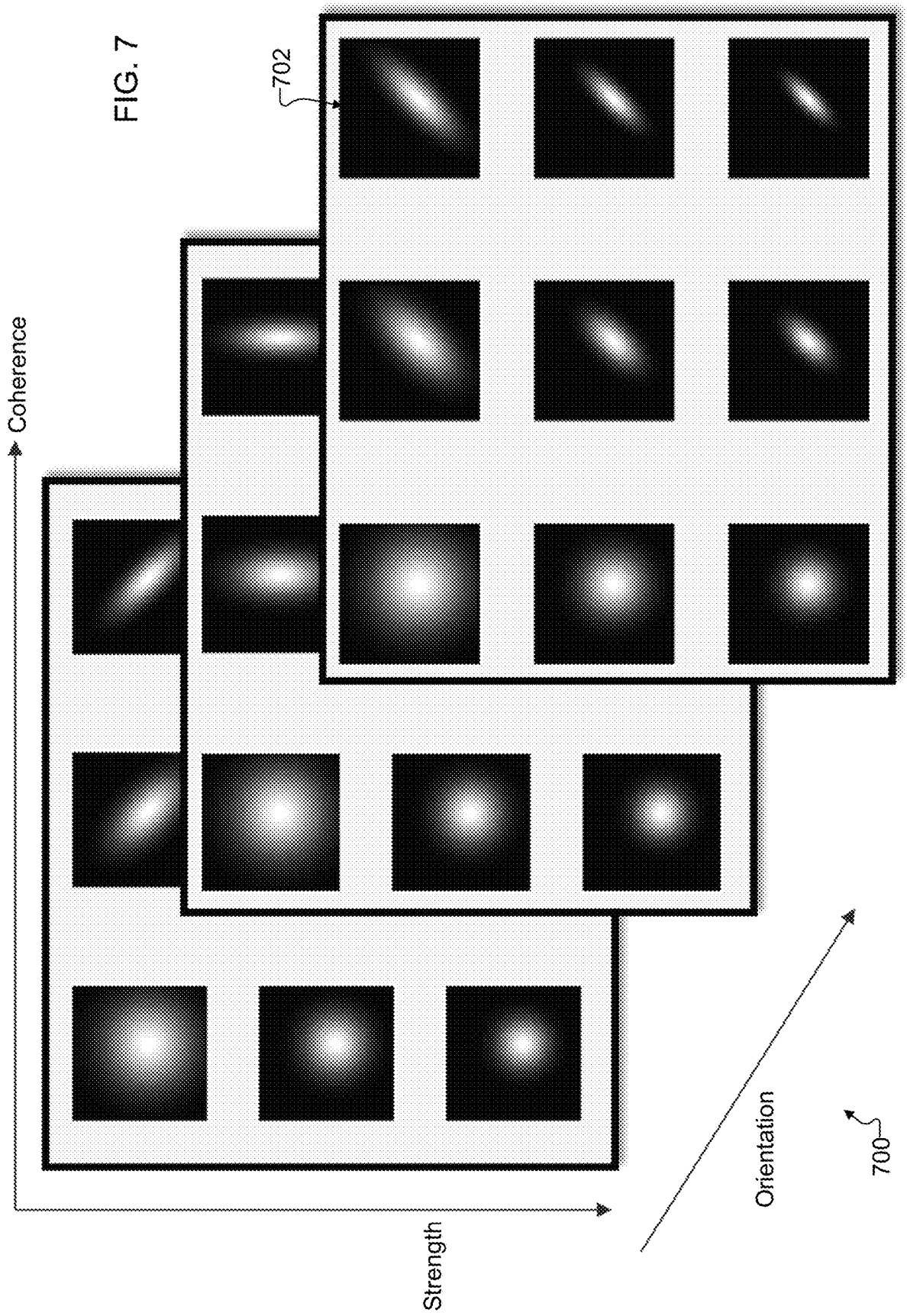

600
Orientation
602
Strength
Coherence
604
1000
2000
3000
4000

FIG. 6

FIG. 7



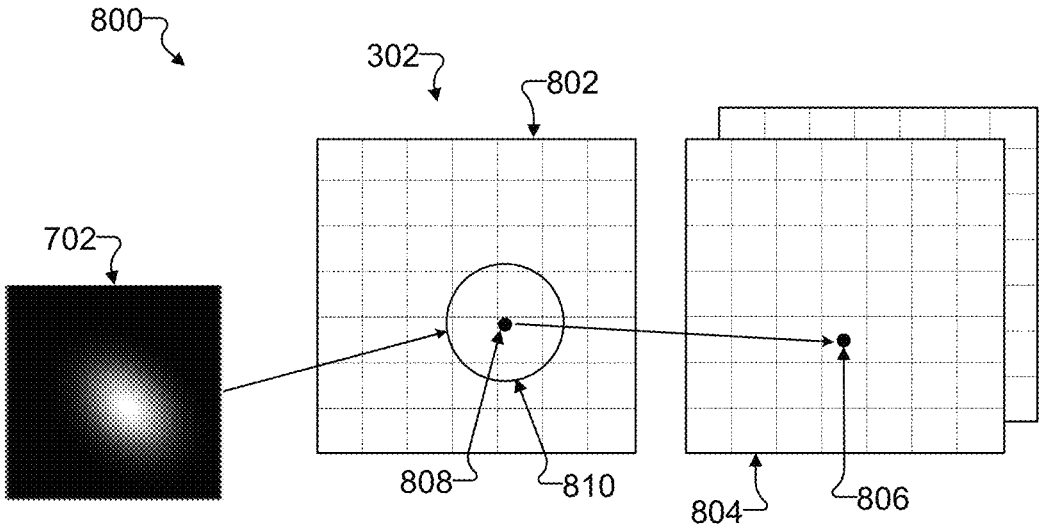


FIG. 8

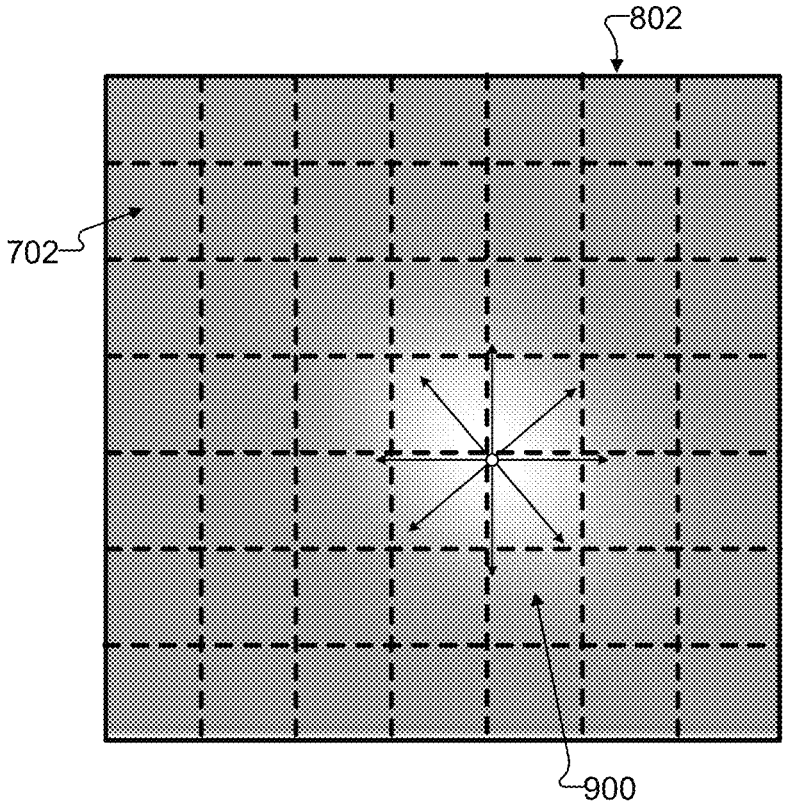


FIG. 9

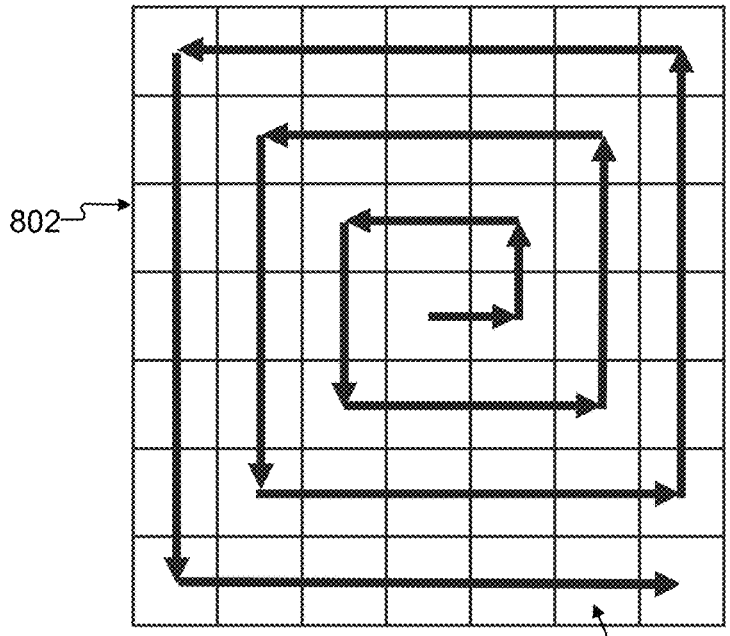

802
1000

FIG. 10

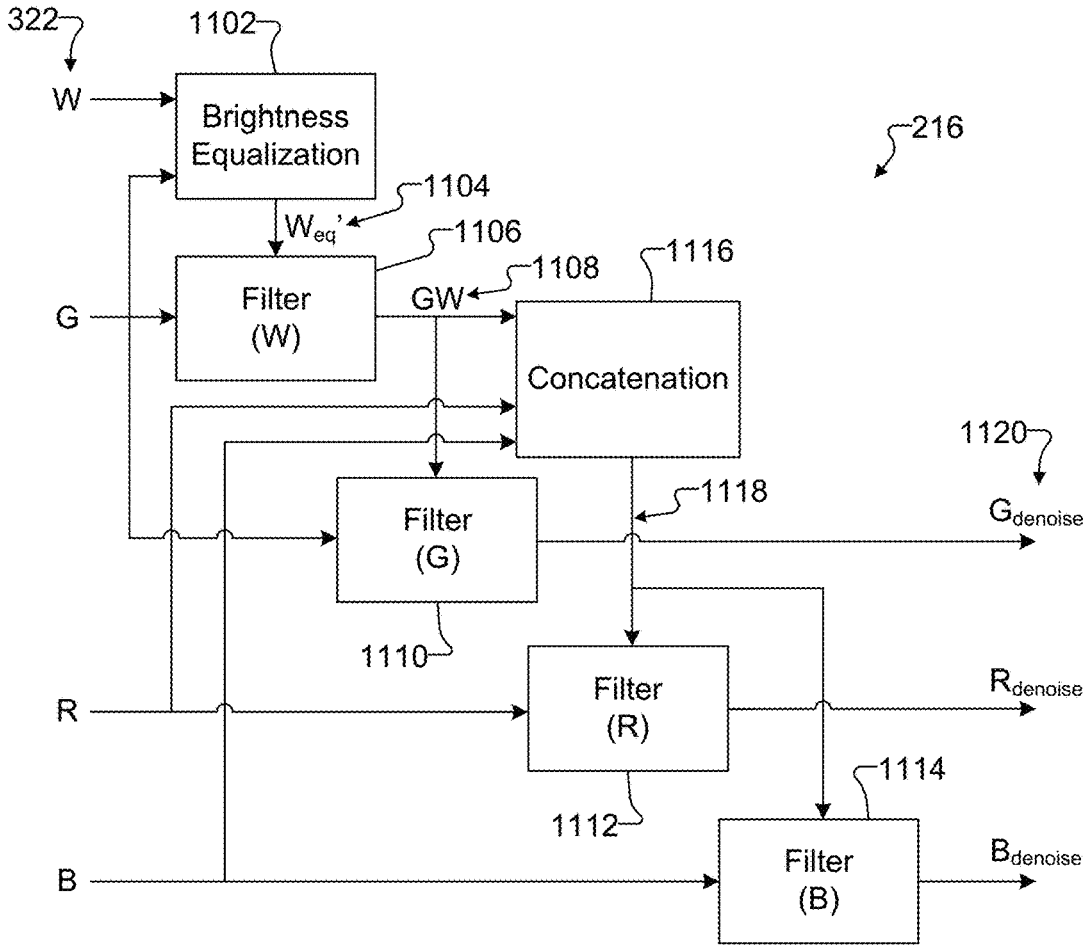

322
1102
W
Brightness Equalization
1104
W_{eq}'
1106
1108
1116
G
Filter (W)
GW
Concatenation
216
1120
1118
$G_{denoise}$
Filter (G)
1110
R
Filter (R)
$R_{denoise}$
1114
1112
B
Filter (B)
$B_{denoise}$

FIG. 11

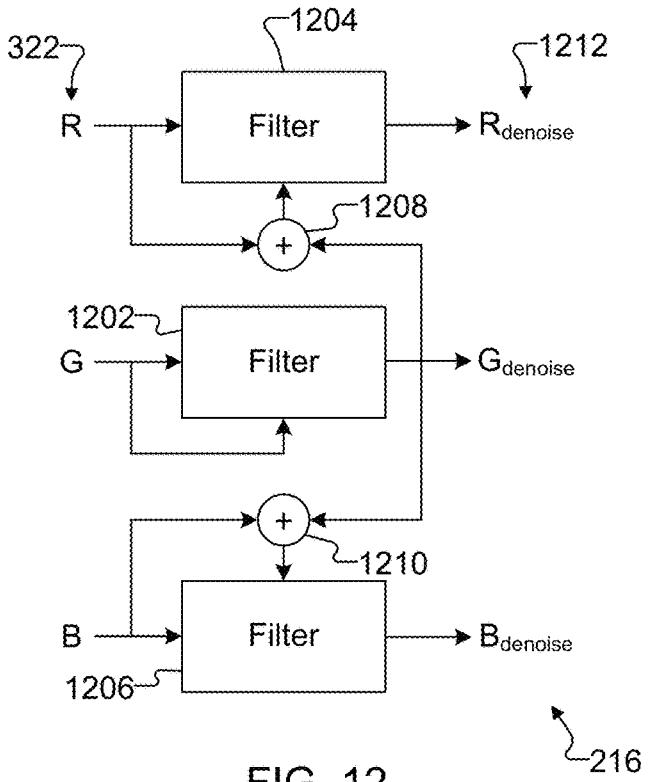

322
1204
1212
R
Filter
$R_{denoise}$
1208
+
1202
G
Filter
$G_{denoise}$
+
1210
B
Filter
$B_{denoise}$
1206
216

FIG. 12

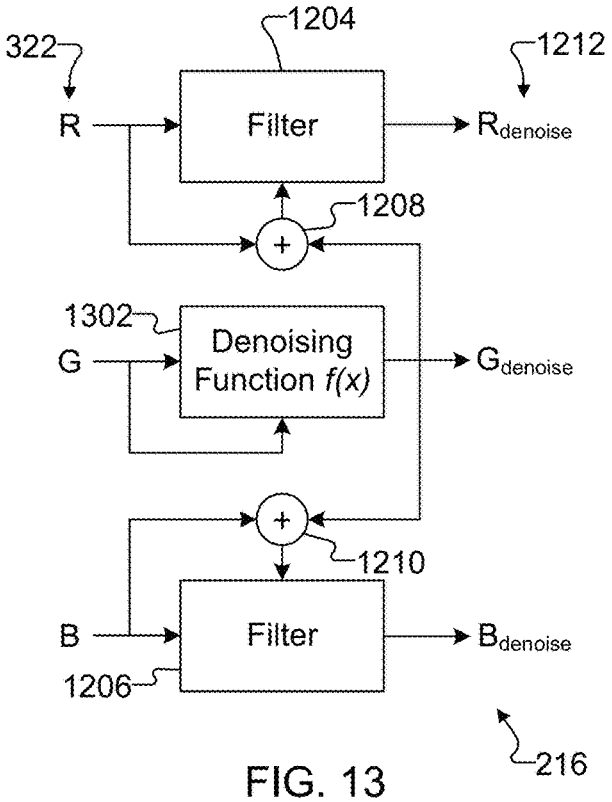

322
1204
1212
R
Filter
$R_{denoise}$
1208
+
1302
G
Denoising Function *f(x)*
$G_{denoise}$
+
1210
B
Filter
$B_{denoise}$
1206
216

FIG. 13

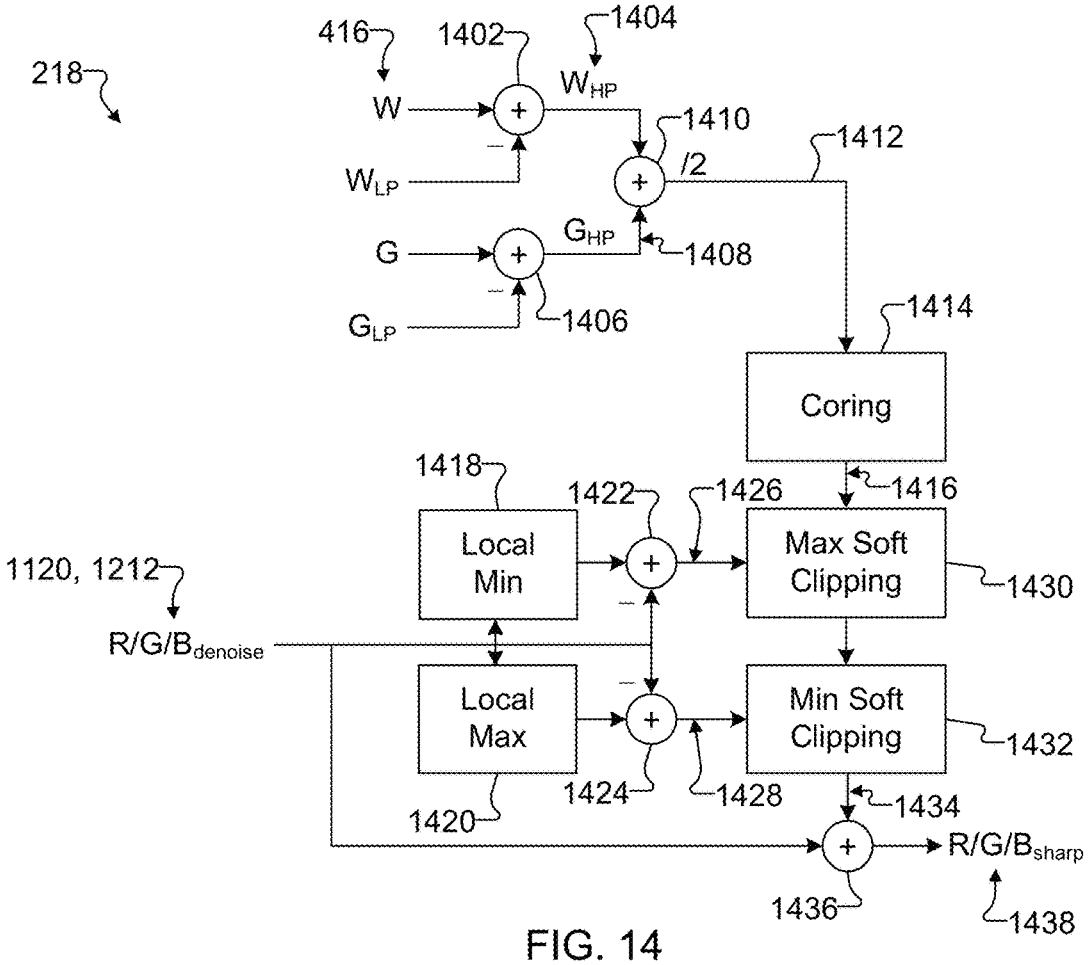

218
416
1402
1404
W
W_{HP}
W_{LP}
1410
/2
1412
G
G_{HP}
1408
G_{LP}
1406
1414
Coring
1418
1422
1426
1416
Local Min
Max Soft Clipping
1430
1120, 1212
$R/G/B_{denoise}$
Local Max
Min Soft Clipping
1432
1424
1428
1434
1420
$R/G/B_{sharp}$
1436
1438

FIG. 14

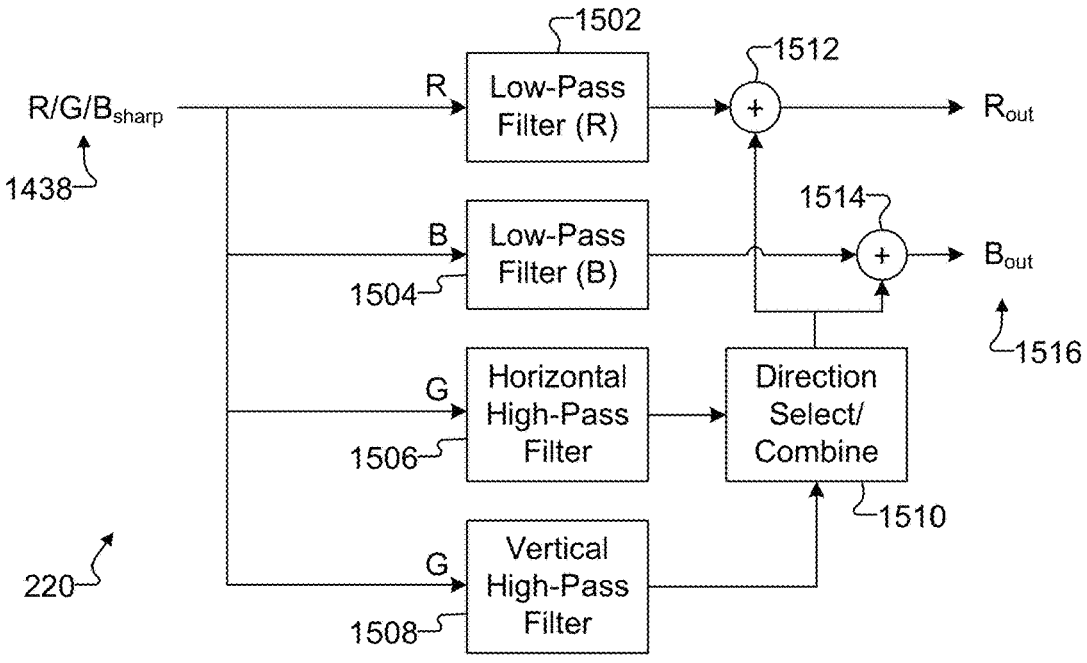

1502
1512
$R/G/B_{sharp}$
R
Low-Pass Filter (R)
R_{out}
1438
1514
B
Low-Pass Filter (B)
B_{out}
1504
1516
G
Horizontal High-Pass Filter
Direction Select/ Combine
1506
1510
220
G
Vertical High-Pass Filter
1508

FIG. 15

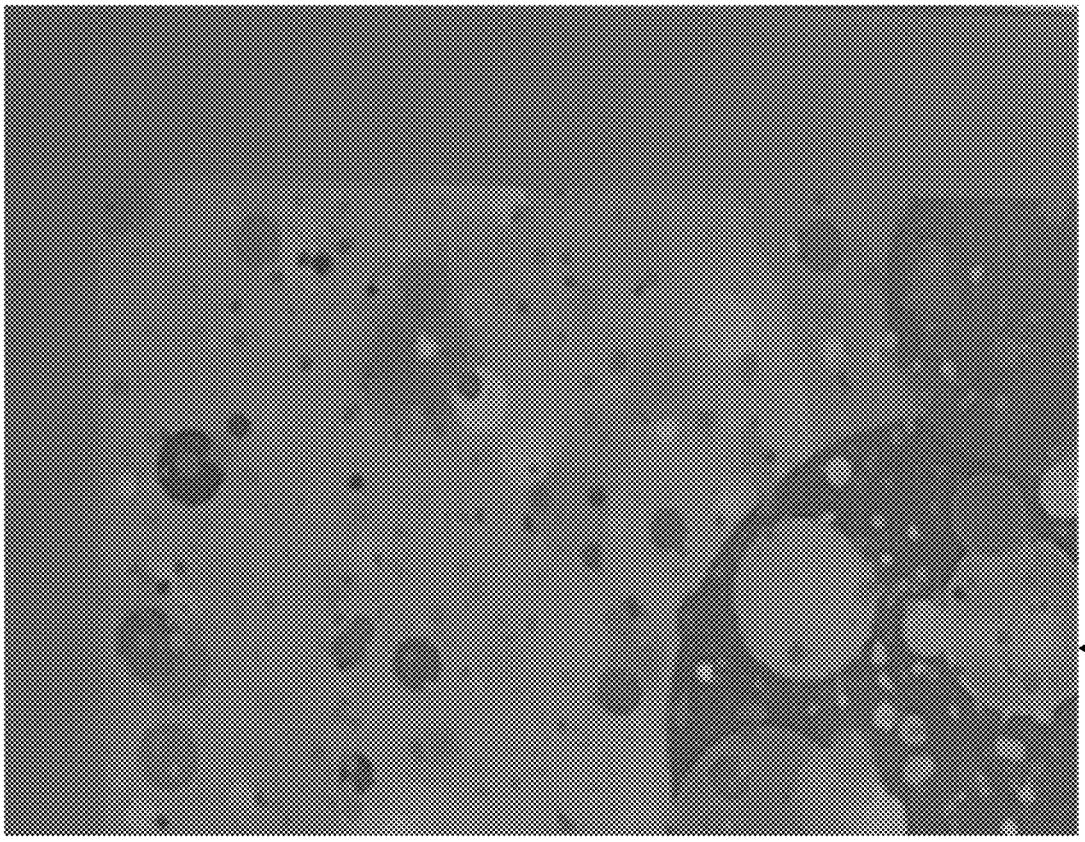


FIG. 16B

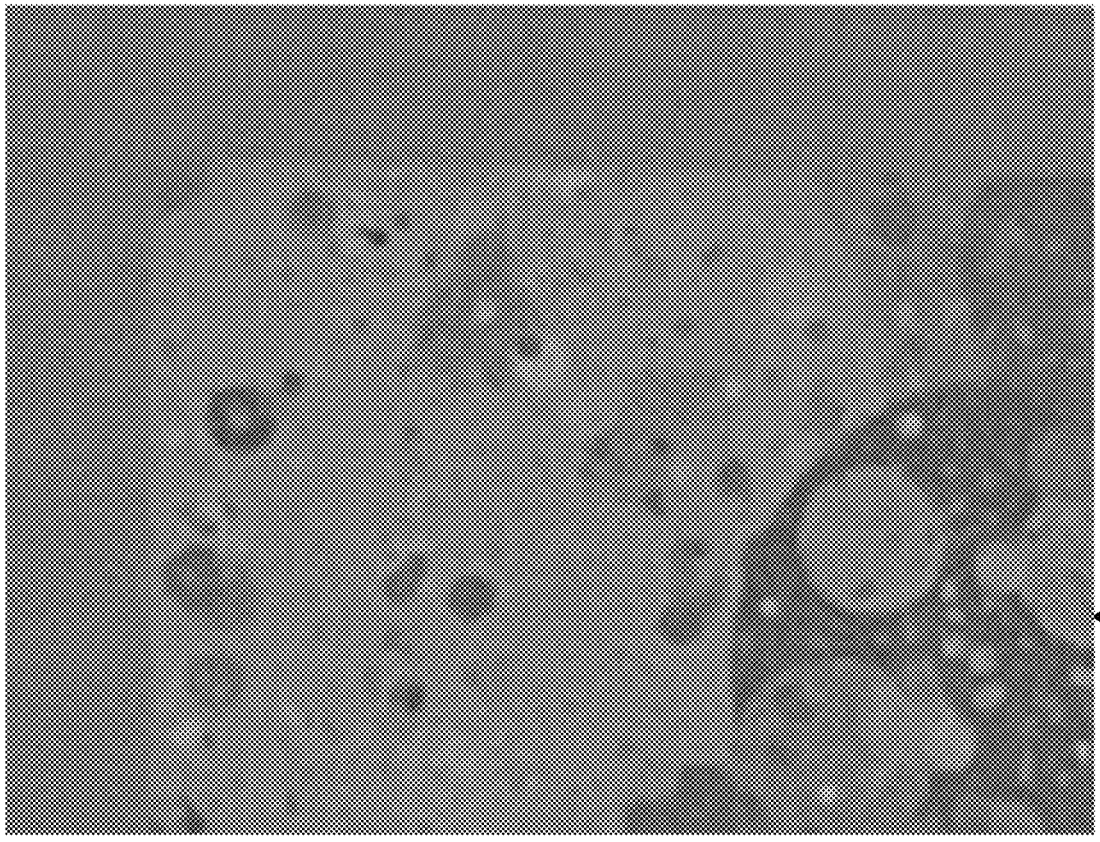


FIG. 16A

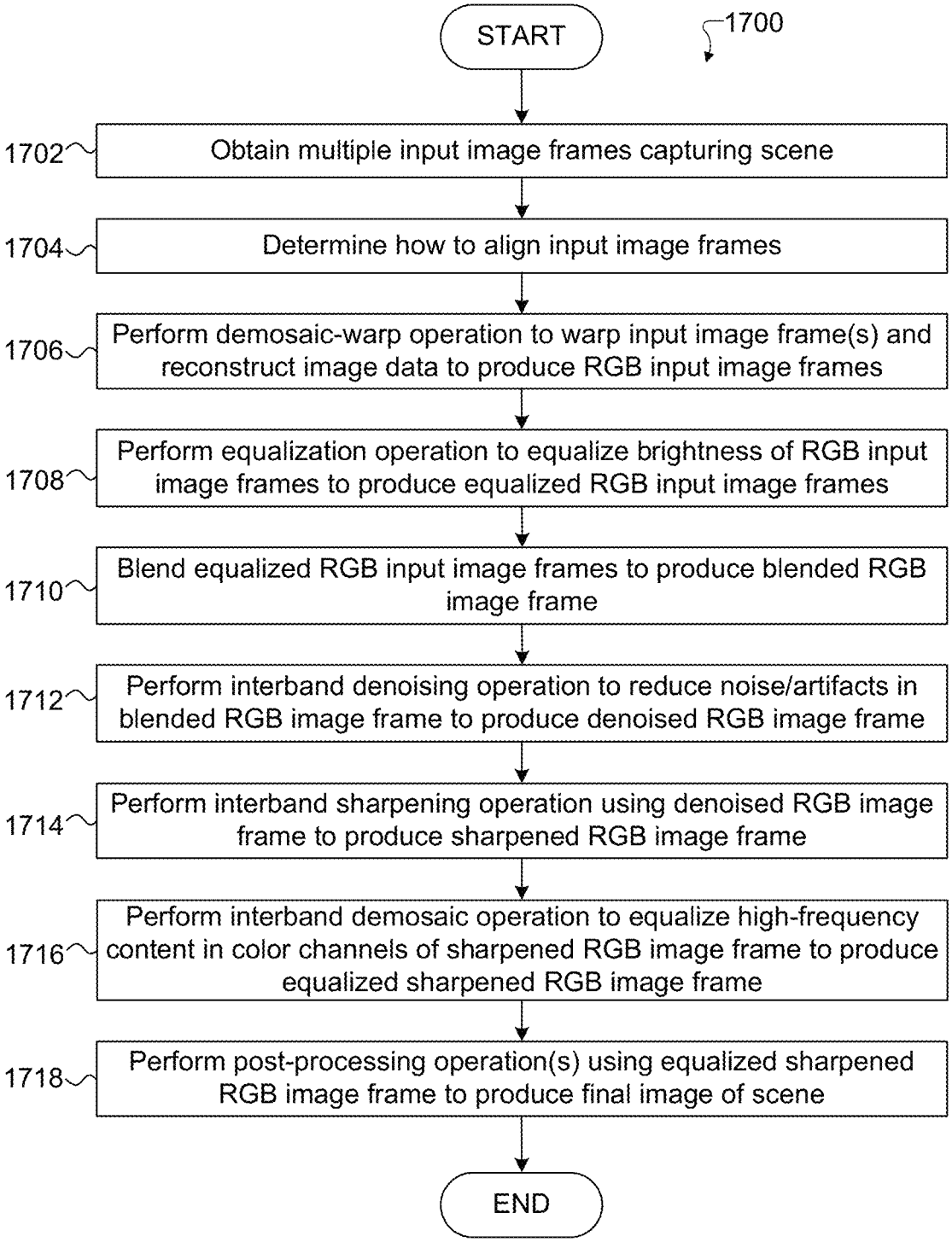

START
1700
1702
Obtain multiple input image frames capturing scene
1704
Determine how to align input image frames
1706
Perform demosaic-warp operation to warp input image frame(s) and reconstruct image data to produce RGB input image frames
1708
Perform equalization operation to equalize brightness of RGB input image frames to produce equalized RGB input image frames
1710
Blend equalized RGB input image frames to produce blended RGB image frame
1712
Perform interband denoising operation to reduce noise/artifacts in blended RGB image frame to produce denoised RGB image frame
1714
Perform interband sharpening operation using denoised RGB image frame to produce sharpened RGB image frame
1716
Perform interband demosaic operation to equalize high-frequency content in color channels of sharpened RGB image frame to produce equalized sharpened RGB image frame
1718
Perform post-processing operation(s) using equalized sharpened RGB image frame to produce final image of scene
END

FIG. 17

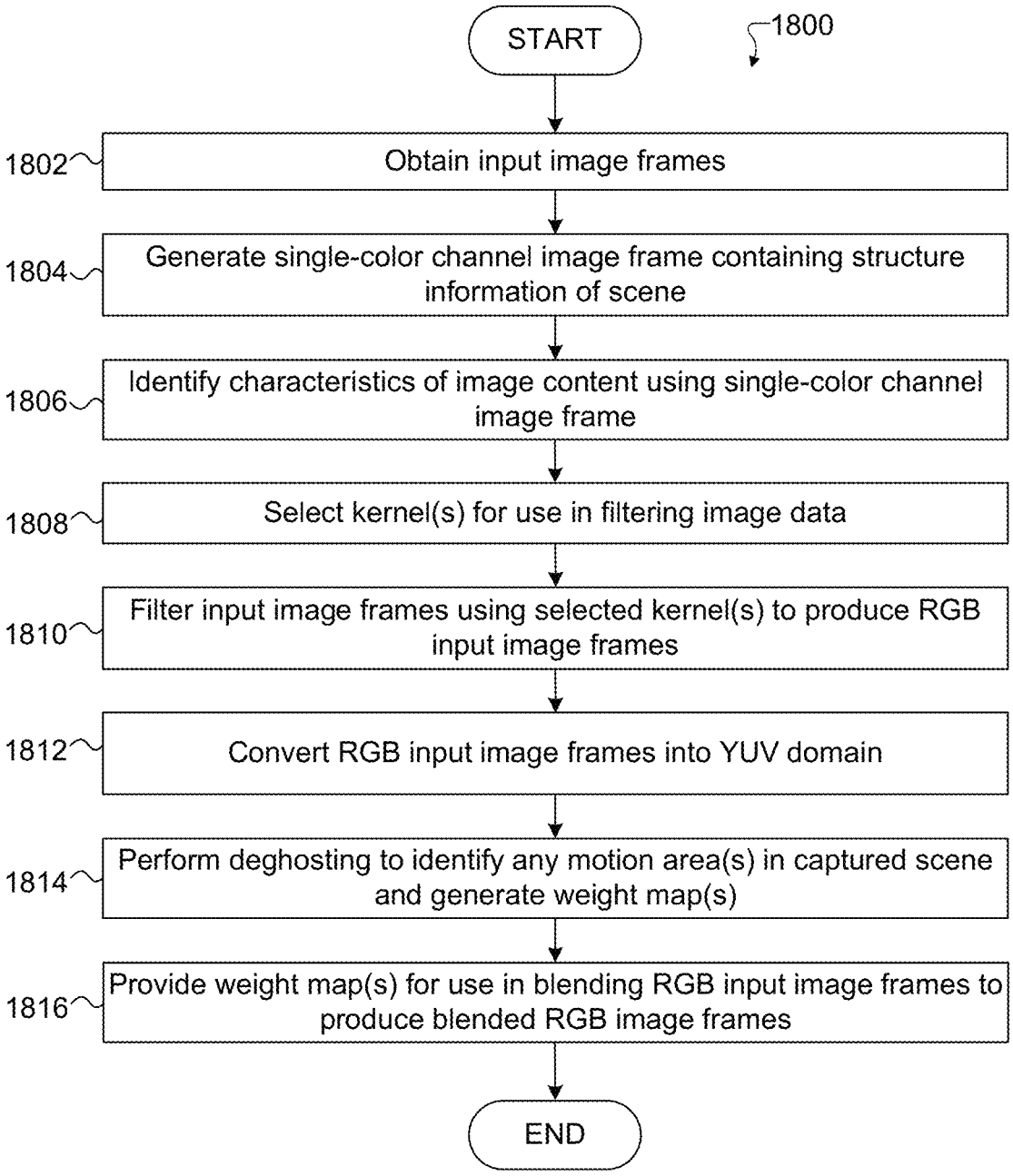

START
1800
1802
Obtain input image frames
1804
Generate single-color channel image frame containing structure information of scene
1806
Identify characteristics of image content using single-color channel image frame
1808
Select kernel(s) for use in filtering image data
1810
Filter input image frames using selected kernel(s) to produce RGB input image frames
1812
Convert RGB input image frames into YUV domain
1814
Perform deghosting to identify any motion area(s) in captured scene and generate weight map(s)
1816
Provide weight map(s) for use in blending RGB input image frames to produce blended RGB image frames
END

FIG. 18

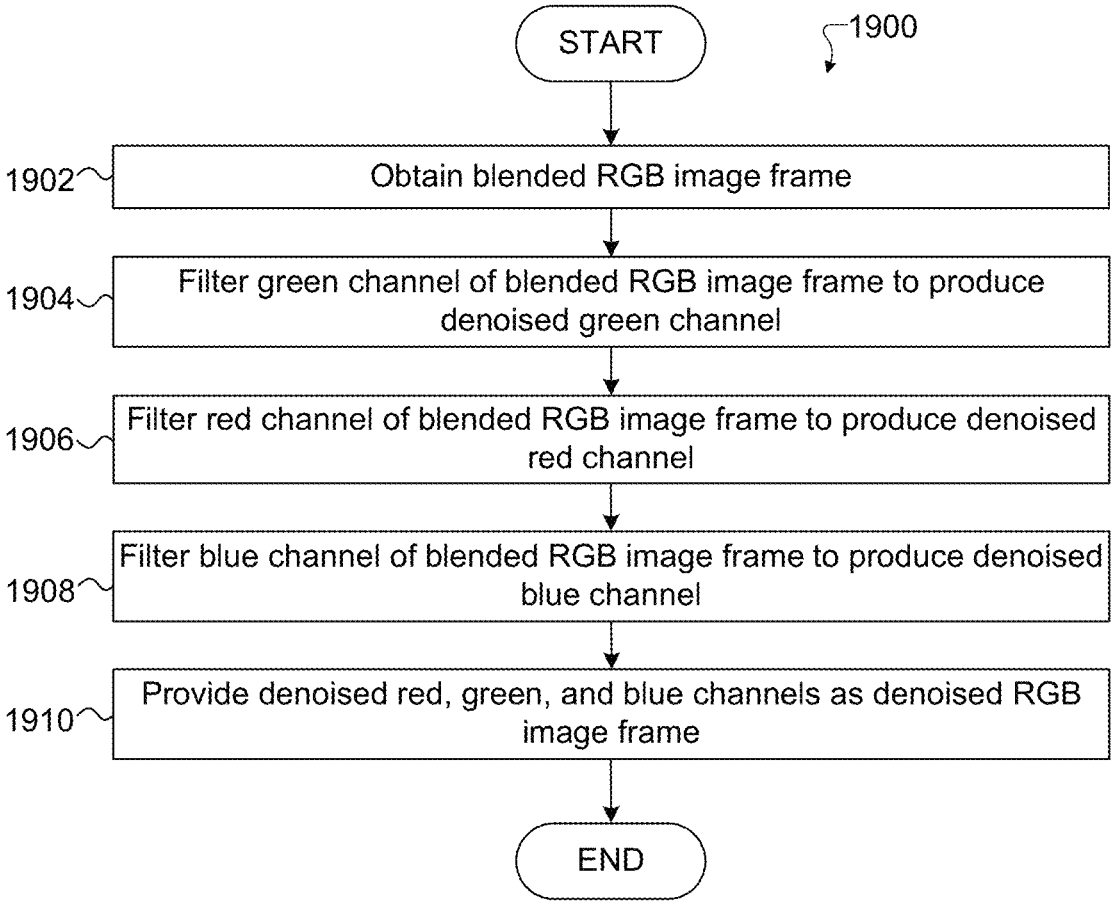

START
1900
1902
Obtain blended RGB image frame
1904
Filter green channel of blended RGB image frame to produce denoised green channel
1906
Filter red channel of blended RGB image frame to produce denoised red channel
1908
Filter blue channel of blended RGB image frame to produce denoised blue channel
1910
Provide denoised red, green, and blue channels as denoised RGB image frame
END

FIG. 19

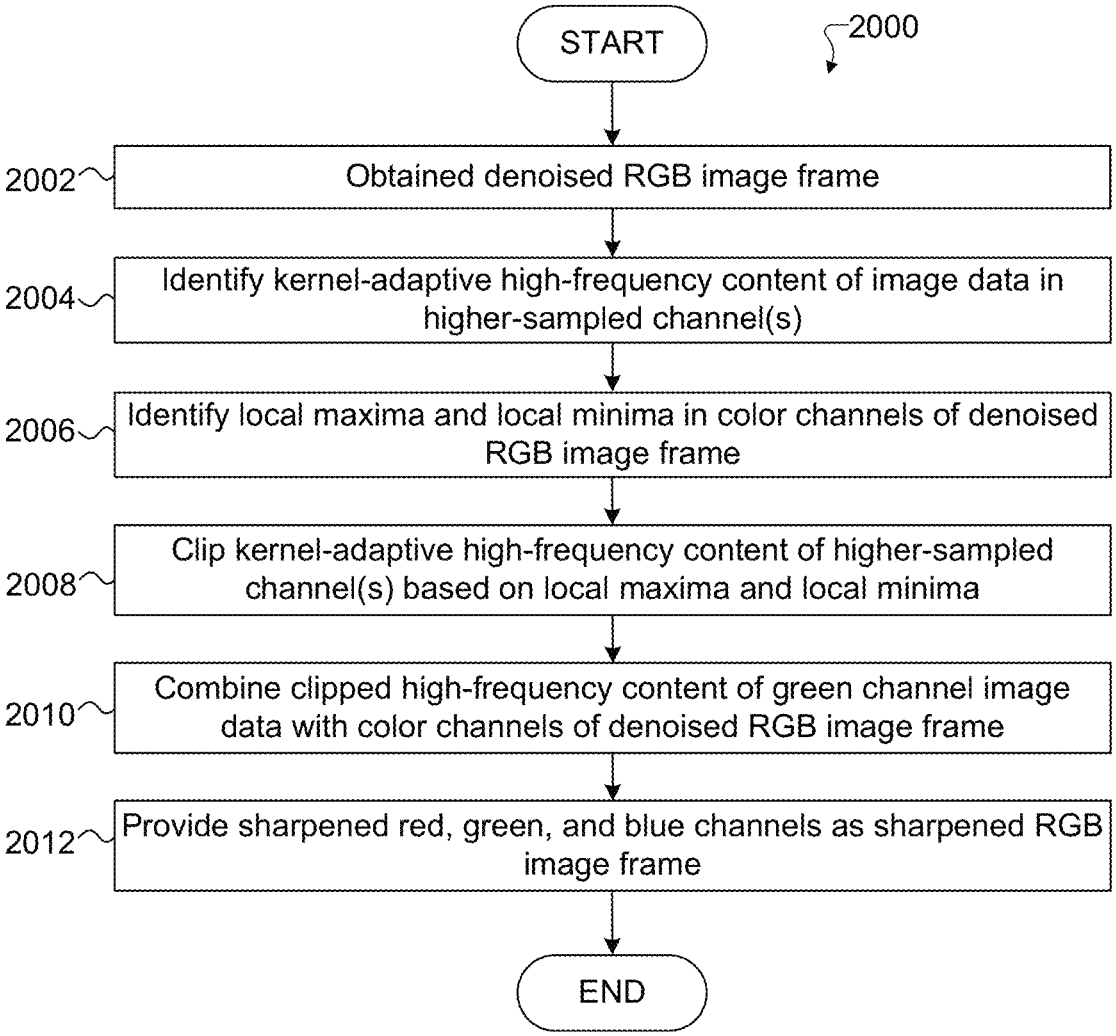

START
2000
2002
Obtained denoised RGB image frame
2004
Identify kernel-adaptive high-frequency content of image data in higher-sampled channel(s)
2006
Identify local maxima and local minima in color channels of denoised RGB image frame
2008
Clip kernel-adaptive high-frequency content of higher-sampled channel(s) based on local maxima and local minima
2010
Combine clipped high-frequency content of green channel image data with color channels of denoised RGB image frame
2012
Provide sharpened red, green, and blue channels as sharpened RGB image frame
END

FIG. 20

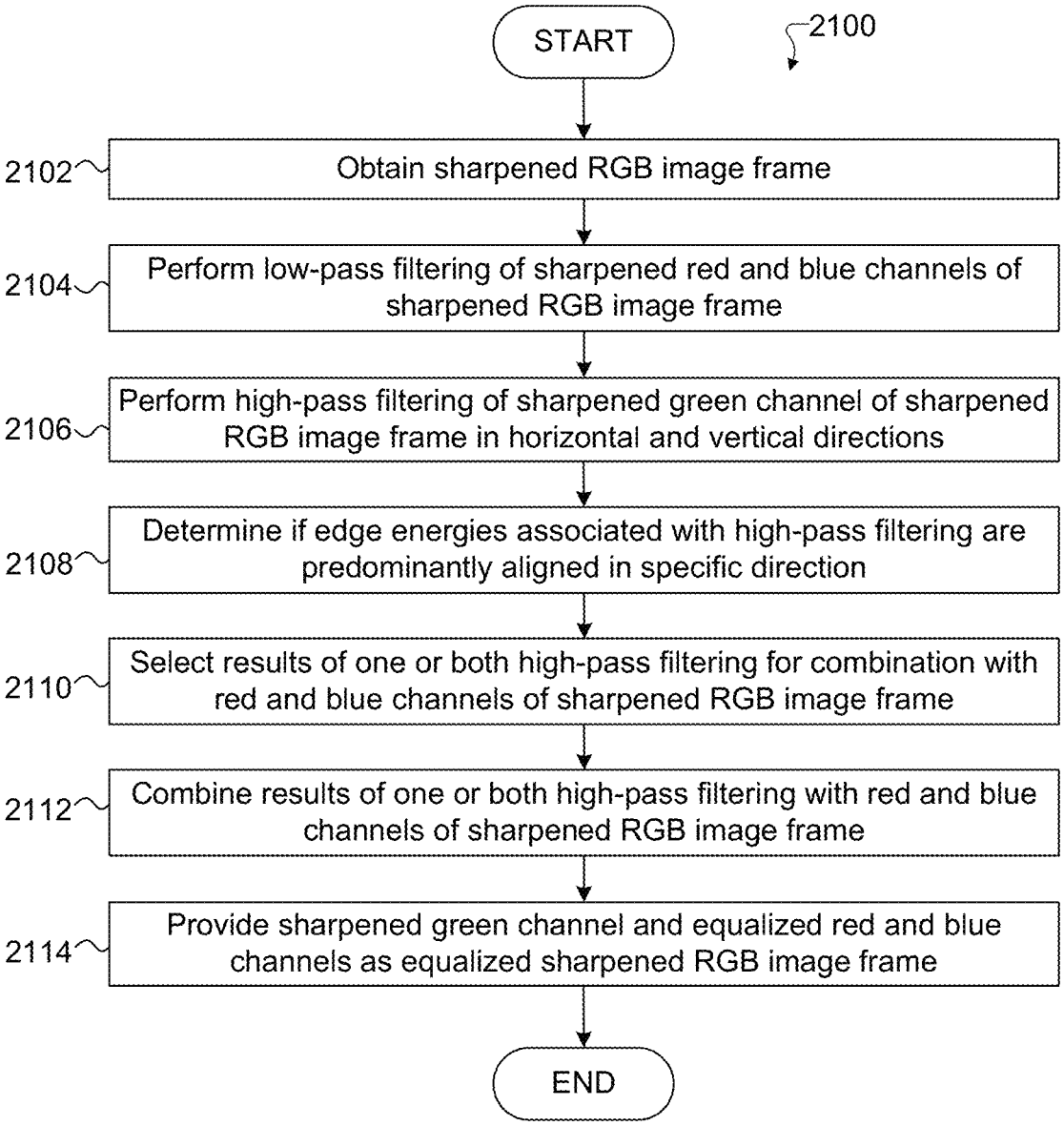

START
2100
2102
Obtain sharpened RGB image frame
2104
Perform low-pass filtering of sharpened red and blue channels of sharpened RGB image frame
2106
Perform high-pass filtering of sharpened green channel of sharpened RGB image frame in horizontal and vertical directions
2108
Determine if edge energies associated with high-pass filtering are predominantly aligned in specific direction
2110
Select results of one or both high-pass filtering for combination with red and blue channels of sharpened RGB image frame
2112
Combine results of one or both high-pass filtering with red and blue channels of sharpened RGB image frame
2114
Provide sharpened green channel and equalized red and blue channels as equalized sharpened RGB image frame
END

FIG. 21

APPARATUS AND METHOD FOR COMBINED INTRABAND AND INTERBAND MULTI-FRAME DEMOSAICING

CROSS-REFERENCE TO RELATED APPLICATION AND PRIORITY CLAIM

This application claims priority under 35 U.S.C. § 119(e) to U.S. Provisional Patent Application No. 63/222,187 filed on Jul. 15, 2021 and to U.S. Provisional Patent Application No. 63/294,462 filed on Dec. 29, 2021. These provisional applications are hereby incorporated by reference in their entirety.

TECHNICAL FIELD

This disclosure relates generally to image processing systems. More specifically, this disclosure relates to an apparatus and method for combined intraband and interband multi-frame demosaicing.

BACKGROUND

Many mobile electronic devices, such as smartphones and tablet computers, include cameras that can be used to capture still and video images. While convenient, cameras on mobile electronic devices typically suffer from a number of shortcomings. For example, many mobile electronic devices often suffer from aliasing artifacts created during the generation of images of scenes. Aliasing artifacts can have various causes depending on the circumstances. Common sources of aliasing artifacts include (i) capturing images while using a digital zoom feature and (ii) performing demosaicing operations to reconstruct image data captured using color filter arrays.

SUMMARY

This disclosure provides an apparatus and method for combined intraband and interband multi-frame demosaicing.

In a first embodiment, a method includes obtaining multiple input image frames of a scene using at least one imaging sensor of an electronic device and determining how to warp at least one of the input image frames in order to more closely align one or more features captured in the input image frames. The method also includes performing, using at least one processing device of an electronic device, an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp the at least one of the input image frames in order to produce red-green-blue (RGB) input image frames. The method further includes blending the RGB input image frames in order to produce a blended RGB image frame. The method also includes performing, using the at least one processing device of the electronic device, an interband denoising operation to remove at least one of noise and one or more artifacts from the blended RGB image frame in order to produce a denoised RGB image frame. The method further includes performing, using the at least one processing device of the electronic device, an interband sharpening operation to sharpen different color channels of the denoised RGB image frame in order to produce a sharpened RGB image frame. In addition, the method includes performing, using the at least one processing device of the electronic device, an interband demosaic operation to substantially equalize high-frequency content in different color channels of the sharpened RGB image frame in order to produce an equalized sharpened RGB image frame and generating a final image of the scene based on the equalized sharpened RGB image frame. In another embodiment, a non-transitory computer readable medium may contain instructions that when executed cause at least one processing device of an electronic device to perform the method of the first embodiment.

In a second embodiment, an electronic device includes at least one imaging sensor and at least one processing device. The at least one processing device is configured to obtain multiple input image frames of a scene using the at least one imaging sensor and determine how to warp at least one of the input image frames in order to more closely align one or more features captured in the input image frames. The at least one processing device is also configured to perform an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp the at least one of the input image frames in order to produce RGB input image frames. The at least one processing device is further configured to blend the RGB input image frames in order to produce a blended RGB image frame, perform an interband denoising operation to remove at least one of noise and one or more artifacts from the blended RGB image frame in order to produce a denoised RGB image frame, and perform an interband sharpening operation to sharpen different color channels of the denoised RGB image frame in order to produce a sharpened RGB image frame. In addition, the at least one processing device is configured to perform an interband demosaic operation to substantially equalize high-frequency content in different color channels of the sharpened RGB image frame in order to produce an equalized sharpened RGB image frame and generate a final image of the scene based on the equalized sharpened RGB image frame.

In a third embodiment, a method includes obtaining multiple input image frames of a scene. The method also includes performing, using at least one processing device of an electronic device, an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp at least one of the input image frames in order to produce RGB input image frames. The method further includes blending, using the at least one processing device, the RGB input image frames in order to produce a blended RGB image frame, wherein blending the RGB input image frames removes one or more aliasing artifacts created during the intraband joint demosaic-warp operation. In another embodiment, an electronic device may include at least one imaging sensor and at least one processing device configured to perform the method of the third embodiment. In still another embodiment, a non-transitory computer readable medium may contain instructions that when executed cause at least one processor of an electronic device to perform the method of the third embodiment.

In a fourth embodiment, a method includes obtaining a blended RGB image frame of a scene. The method also includes performing, using at least one processing device of an electronic device, an interband demosaic operation to substantially equalize high-frequency content in red, green, and blue color channels of the blended RGB image frame in order to produce an equalized RGB image frame. The equalized RGB image frame includes the green color channel of the blended RGB image frame and equalized red and blue color channels produced during the interband demosaic operation. In another embodiment, an electronic device may include at least one imaging sensor and at least one pro-

cessing device configured to perform the method of the fourth embodiment. In still another embodiment, a non-transitory computer readable medium may contain instructions that when executed cause at least one processor of an electronic device to perform the method of the fourth embodiment.

Other technical features may be readily apparent to one skilled in the art from the following figures, descriptions, and claims.

Before undertaking the DETAILED DESCRIPTION below, it may be advantageous to set forth definitions of certain words and phrases used throughout this patent document. The terms "transmit," "receive," and "communicate," as well as derivatives thereof, encompass both direct and indirect communication. The terms "include" and "comprise," as well as derivatives thereof, mean inclusion without limitation. The term "or" is inclusive, meaning and/or. The phrase "associated with," as well as derivatives thereof, means to include, be included within, interconnect with, contain, be contained within, connect to or with, couple to or with, be communicable with, cooperate with, interleave, juxtapose, be proximate to, be bound to or with, have, have a property of, have a relationship to or with, or the like.

Moreover, various functions described below can be implemented or supported by one or more computer programs, each of which is formed from computer readable program code and embodied in a computer readable medium. The terms "application" and "program" refer to one or more computer programs, software components, sets of instructions, procedures, functions, objects, classes, instances, related data, or a portion thereof adapted for implementation in a suitable computer readable program code. The phrase "computer readable program code" includes any type of computer code, including source code, object code, and executable code. The phrase "computer readable medium" includes any type of medium capable of being accessed by a computer, such as read only memory (ROM), random access memory (RAM), a hard disk drive, a compact disc (CD), a digital video disc (DVD), or any other type of memory. A "non-transitory" computer readable medium excludes wired, wireless, optical, or other communication links that transport transitory electrical or other signals. A non-transitory computer readable medium includes media where data can be permanently stored and media where data can be stored and later overwritten, such as a rewritable optical disc or an erasable memory device.

As used here, terms and phrases such as "have," "may have," "include," or "may include" a feature (like a number, function, operation, or component such as a part) indicate the existence of the feature and do not exclude the existence of other features. Also, as used here, the phrases "A or B," "at least one of A and/or B," or "one or more of A and/or B" may include all possible combinations of A and B. For example, "A or B," "at least one of A and B," and "at least one of A or B" may indicate all of (1) including at least one A, (2) including at least one B, or (3) including at least one A and at least one B. Further, as used here, the terms "first" and "second" may modify various components regardless of importance and do not limit the components. These terms are only used to distinguish one component from another. For example, a first user device and a second user device may indicate different user devices from each other, regardless of the order or importance of the devices. A first component may be denoted a second component and vice versa without departing from the scope of this disclosure.

It will be understood that, when an element (such as a first element) is referred to as being (operatively or communicatively) "coupled with/to" or "connected with/to" another element (such as a second element), it can be coupled or connected with/to the other element directly or via a third element. In contrast, it will be understood that, when an element (such as a first element) is referred to as being "directly coupled with/to" or "directly connected with/to" another element (such as a second element), no other element (such as a third element) intervenes between the element and the other element.

As used here, the phrase "configured (or set) to" may be interchangeably used with the phrases "suitable for," "having the capacity to," "designed to," "adapted to," "made to," or "capable of" depending on the circumstances. The phrase "configured (or set) to" does not essentially mean "specifically designed in hardware to." Rather, the phrase "configured to" may mean that a device can perform an operation together with another device or parts. For example, the phrase "processor configured (or set) to perform A, B, and C" may mean a generic-purpose processor (such as a CPU or application processor) that may perform the operations by executing one or more software programs stored in a memory device or a dedicated processor (such as an embedded processor) for performing the operations.

The terms and phrases as used here are provided merely to describe some embodiments of this disclosure but not to limit the scope of other embodiments of this disclosure. It is to be understood that the singular forms "a," "an," and "the" include plural references unless the context clearly dictates otherwise. All terms and phrases, including technical and scientific terms and phrases, used here have the same meanings as commonly understood by one of ordinary skill in the art to which the embodiments of this disclosure belong. It will be further understood that terms and phrases, such as those defined in commonly-used dictionaries, should be interpreted as having a meaning that is consistent with their meaning in the context of the relevant art and will not be interpreted in an idealized or overly formal sense unless expressly so defined here. In some cases, the terms and phrases defined here may be interpreted to exclude embodiments of this disclosure.

Examples of an "electronic device" according to embodiments of this disclosure may include at least one of a smartphone, a tablet personal computer (PC), a mobile phone, a video phone, an e-book reader, a desktop PC, a laptop computer, a netbook computer, a workstation, a personal digital assistant (PDA), a portable multimedia player (PMP), an MP3 player, a mobile medical device, a camera, or a wearable device (such as smart glasses, a head-mounted device (HMD), electronic clothes, an electronic bracelet, an electronic necklace, an electronic accessory, an electronic tattoo, a smart mirror, or a smart watch). Other examples of an electronic device include a smart home appliance. Examples of the smart home appliance may include at least one of a television, a digital video disc (DVD) player, an audio player, a refrigerator, an air conditioner, a cleaner, an oven, a microwave oven, a washer, a drier, an air cleaner, a set-top box, a home automation control panel, a security control panel, a TV box (such as SAMSUNG HOMESYNC, APPLETV, or GOOGLE TV), a smart speaker or speaker with an integrated digital assistant (such as SAMSUNG GALAXY HOME, APPLE HOMEPOD, or AMAZON ECHO), a gaming console (such as an XBOX, PLAYSTATION, or NINTENDO), an electronic dictionary, an electronic key, a camcorder, or an electronic picture frame. Still other examples of an electronic device include at least one of various medical devices (such as diverse portable medical measuring devices (like a blood

sugar measuring device, a heartbeat measuring device, or a body temperature measuring device), a magnetic resource angiography (MRA) device, a magnetic resource imaging (MRI) device, a computed tomography (CT) device, an imaging device, or an ultrasonic device), a navigation device, a global positioning system (GPS) receiver, an event data recorder (EDR), a flight data recorder (FDR), an automotive infotainment device, a sailing electronic device (such as a sailing navigation device or a gyro compass), avionics, security devices, vehicular head units, industrial or home robots, automatic teller machines (ATMs), point of sales (POS) devices, or Internet of Things (IoT) devices (such as a bulb, various sensors, electric or gas meter, sprinkler, fire alarm, thermostat, street light, toaster, fitness equipment, hot water tank, heater, or boiler). Other examples of an electronic device include at least one part of a piece of furniture or building/structure, an electronic board, an electronic signature receiving device, a projector, or various measurement devices (such as devices for measuring water, electricity, gas, or electromagnetic waves). Note that, according to various embodiments of this disclosure, an electronic device may be one or a combination of the above-listed devices. According to some embodiments of this disclosure, the electronic device may be a flexible electronic device. The electronic device disclosed here is not limited to the above-listed devices and may include new electronic devices depending on the development of technology.

In the following description, electronic devices are described with reference to the accompanying drawings, according to various embodiments of this disclosure. As used here, the term "user" may denote a human or another device (such as an artificial intelligent electronic device) using the electronic device.

Definitions for other certain words and phrases may be provided throughout this patent document. Those of ordinary skill in the art should understand that in many if not most instances, such definitions apply to prior as well as future uses of such defined words and phrases.

None of the description in this application should be read as implying that any particular element, step, or function is an essential element that must be included in the claim scope. The scope of patented subject matter is defined only by the claims. Moreover, none of the claims is intended to invoke 35 U.S.C. § 112(f) unless the exact words "means for" are followed by a participle. Use of any other term, including without limitation "mechanism," "module," "device," "unit," "component," "element," "member," "apparatus," "machine," "system," "processor," or "controller," within a claim is understood by the Applicant to refer to structures known to those skilled in the relevant art and is not intended to invoke 35 U.S.C. § 112(f).

BRIEF DESCRIPTION OF THE DRAWINGS

For a more complete understanding of this disclosure and its advantages, reference is now made to the following description taken in conjunction with the accompanying drawings, in which like reference numerals represent like parts:

FIG. **1** illustrates an example network configuration including an electronic device in accordance with this disclosure;

FIG. **2** illustrates an example image processing architecture that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure;

FIG. **3** illustrates an example demosaic-warp function and example interactions between the demosaic-warp function, a single-exposure blending function, and a multi-exposure blending function in the image processing architecture of FIG. **2** according to this disclosure;

FIG. **4** illustrates an example warp and interpolation function in the demosaic-warp function of FIG. **3** according to this disclosure;

FIG. **5** illustrates an example white-guided image structure generation function in the warp and interpolation function of FIG. **4** according to this disclosure;

FIG. **6** illustrates example values that may be generated by a gradient structure tensor function in the warp and interpolation function of FIG. **4** according to this disclosure;

FIG. **7** illustrates an example kernel bank that may be used by a kernel selection function in the warp and interpolation function of FIG. **4** according to this disclosure;

FIG. **8** illustrates example operation of a bilateral interpolation filter in the warp and interpolation function of FIG. **4** according to this disclosure;

FIGS. **9** and **10** illustrate example interpolation paths that may be used by a bilateral interpolation filter in the warp and interpolation function of FIG. **4** according to this disclosure;

FIG. **11** illustrates a first example interband denoising function in the image processing architecture of FIG. **2** according to this disclosure;

FIG. **12** illustrates a second example interband denoising function in the image processing architecture of FIG. **2** according to this disclosure;

FIG. **13** illustrates a third example interband denoising function in the image processing architecture of FIG. **2** according to this disclosure;

FIG. **14** illustrates an example interband sharpening function in the image processing architecture of FIG. **2** according to this disclosure;

FIG. **15** illustrates an example interband demosaic function in the image processing architecture of FIG. **2** according to this disclosure;

FIGS. **16**A and **16**B illustrate example results that may be obtained using an image processing architecture that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure;

FIG. **17** illustrates an example method for multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure;

FIG. **18** illustrates an example method for intraband demosaicing according to this disclosure;

FIG. **19** illustrates an example method for interband denoising according to this disclosure;

FIG. **20** illustrates an example method for interband sharpening according to this disclosure;

FIG. **21** illustrates an example method for interband demosaicing according to this disclosure.

DETAILED DESCRIPTION

FIGS. **1** through **21**, discussed below, and the various embodiments of this disclosure are described with reference to the accompanying drawings. However, it should be appreciated that this disclosure is not limited to these embodiments, and all changes and/or equivalents or replacements thereto also belong to the scope of this disclosure. The same

or similar reference denotations may be used to refer to the same or similar elements throughout the specification and the drawings.

As noted above, many mobile electronic devices, such as smartphones and tablet computers, include cameras that can be used to capture still and video images. While convenient, cameras on mobile electronic devices typically suffer from a number of shortcomings. For example, many mobile electronic devices often suffer from aliasing artifacts created during the generation of images of scenes. Aliasing artifacts can have various causes depending on the circumstances. Common sources of aliasing artifacts include (i) capturing images while using a digital zoom feature and (ii) performing demosaicing operations to reconstruct image data captured using color filter arrays.

Demosaicing refers to a process where a full-color image frame can be reconstructed based on image data captured by an imaging sensor that uses a color filter array. A color filter array represents an array of color filters, where each color filter typically passes light of a specific color spectrum (such as red, green, blue, or white) to an associated pixel and where different pixels capture image data for different color spectra. The data associated with each color spectrum may be referred to as a "channel" for an image frame. When a color filter array is used, only one color spectrum is typically sampled at each pixel for an image frame. Demosaicing may be used to convert image data produced using a Bayer filter array or other color filter array into reconstructed red-green-blue (RGB) data. For example, a demosaicing process can perform various interpolations to fill in missing information, such as by estimating other colors' image data for each pixel. Moreover, when using a Bayer filter array or some other types of color filter arrays, approximately twice as many pixels may capture image data using green filters compared to pixels that capture image data using red or blue filters. This introduces non-uniformities into the captured image data, such as when the red and blue image data each have a lower signal-to-noise ratio (SNR) and a lower sampling rate compared to the green image data. Among other things, the green image data can capture high-frequency image content more effectively than the red and blue image data. The demosaicing process can take information captured by at least one highly-sampled channel (such as the green channel and/or the white channel) and use that information to correct limitations of lower-sampled channels (such as the red and blue channels), which can help to reintroduce high-frequency image content into the red and blue image data. However, standard demosaicing techniques are single-frame techniques, which means they operate to adjust image data within each individual image frame. Single-frame demosaicing techniques introduce aliasing artifacts into generated images of scenes, such as by producing aliasing artifacts along edges of objects in scenes, which can degrade image quality.

A digital zoom feature refers to a feature where the appearance of zooming (narrowing a camera's field of view onto a smaller portion of a scene) is achieved digitally rather than optically. Optical zoom is typically achieved by moving lenses or otherwise manipulating one or more optical devices. Digital zoom is typically achieved programmatically by scaling a captured image frame, such as by performing interpolations using captured image data in order to artificially increase the image data's sampling rate. However, digital zooming often introduces aliasing artifacts, such as by degrading the appearance of edges in generated images of scenes, which can also degrade image quality.

As described in more detail below, multi-frame blending of multiple input image frames is used in order to reduce artifacts caused by one or more aliasing phenomena. For example, one or more imaging sensors may be used to capture multiple input image frames associated with a scene, where small shifts may occur in the position(s) of the one or more imaging sensors during the capture of the input image frames. As a result, the input image frames may capture the same scene, but there are typically small variations between the input image frames.

In one aspect, this disclosure provides techniques for combined intraband and interband multi-frame demosaicing. An "intraband" demosaicing operation can be applied to the input image frames in order to produce RGB input image frames. The intraband demosaicing operation here can be performed in order to convert image data (such as from Bayer or other data to RGB data) and/or to perform image scaling or resizing (such as during digital zooming). The RGB input image frames can be blended in order to produce blended RGB image frames, which in some cases may represent high dynamic range (HDR) image frames. In some embodiments, the intraband demosaicing operation supports the use of a diverse set of filter kernels to perform a scaling/interpolation process, where the specific kernel(s) used with specific image data can be selected by locally measuring image content and selecting the most appropriate kernel(s) according to factors such as gradient strength, coherence, and orientation of the image content. While each RGB input image frame may contain aliasing (such as from scaling and demosaicing), the blending here can reduce or eliminate this aliasing within each channel (red, green, and blue) of the blended RGB image frames. Since aliasing in a demosaicing process and aliasing in a scaling process may each be modeled as a zero-mean random process, blending multiple image frames from this random process tends to average back to a mean of zero, which means that aliasing caused by the intraband demosaicing operation can be significantly reduced or eliminated.

There may still be missing high-frequency content in the red and blue image data compared to the green image data even after the intraband demosaicing operation and other image processing operations have occurred. Thus, an "interband" demosaicing operation can subsequently be performed to reduce or eliminate remaining aliasing. For example, the interband demosaicing operation can substantially equalize high-frequency content in various channels, such as by substantially equalizing the high-frequency content in the red, green, and blue image data, in order to improve edge quality and perception of image blur. The interband demosaicing operation may also identify areas of image frames associated with motion within a scene. These areas of the image frames are often not blended so as to avoid the creation of motion blur, and the interband demosaicing operation contributes to at least partially removing any aliasing that is present when the blending output is the same as a single-frame output.

In another aspect, this disclosure provides techniques for interband denoising and interband sharpening for use with image data captured using a color filter array (such as a Bayer color filter array or a red-green-blue-white or "RGBW" color filter array). Interband denoising and interband sharpening operations can be performed to improve the quality of subsampled or "secondary" channels (such as the red and blue channels) using the higher-quality or "primary" channel(s) (such as the green channel and/or the white channel) having a higher sampling rate. This helps to substantially equalize the signal quality across all of an

image frame's color channels. For instance, the interband denoising operation can reduce artifacts (such as sampling, interpolation, and aliasing artifacts) and noise in secondary channels by using the image data from the primary channel(s). The interband sharpening operation can use an adaptive kernel design to adapt to the specific nature of the high-frequency content in the primary channel(s) to naturally add image details to the secondary channels without creating halo artifacts. This allows the interband sharpening operation to add halo artifact-free details into the secondary channels.

Among other things, these approaches may be used to reduce noise, reduce scaling artifacts and other artifacts, provide high dynamic range, and preserve fine image details in final images of scenes. Note that it is often assumed below that both (i) combined intraband and interband multi-frame demosaicing and (ii) interband denoising and interband sharpening may be used together in the same electronic device when generating images of scenes. This is for illustration and explanation only, and an electronic device may implement only one of these two overall functionalities in other cases. In still other cases, an electronic device may implement only one of these two overall functionalities when generating some images of scenes and may implement both of these two overall functionalities when generating other images of scenes.

FIG. **1** illustrates an example network configuration **100** including an electronic device in accordance with this disclosure. The embodiment of the network configuration **100** shown in FIG. **1** is for illustration only. Other embodiments of the network configuration **100** could be used without departing from the scope of this disclosure.

According to embodiments of this disclosure, an electronic device **101** is included in the network configuration **100**. The electronic device **101** can include at least one of a bus **110**, a processor **120**, a memory **130**, an input/output (I/O) interface **150**, a display **160**, a communication interface **170**, or a sensor **180**. In some embodiments, the electronic device **101** may exclude at least one of these components or may add at least one other component. The bus **110** includes a circuit for connecting the components **120-180** with one another and for transferring communications (such as control messages and/or data) between the components.

The processor **120** includes one or more of a central processing unit (CPU), an application processor (AP), or a communication processor (CP). The processor **120** is able to perform control on at least one of the other components of the electronic device **101** and/or perform an operation or data processing relating to communication. In some embodiments, the processor **120** can be a graphics processor unit (GPU). In some cases, the processor **120** can receive image data captured by at least one imaging sensor and process the image data to perform combined intraband and interband multi-frame demosaicing. In other cases, the processor **120** can receive image data captured by at least one imaging sensor and process the image data to perform interband denoising and interband sharpening. In still other cases, the processor **120** can receive image data captured by at least one imaging sensor and process the image data to perform combined intraband and interband multi-frame demosaicing and to perform interband denoising and interband sharpening.

The memory **130** can include a volatile and/or non-volatile memory. For example, the memory **130** can store commands or data related to at least one other component of the electronic device **101**. According to embodiments of this disclosure, the memory **130** can store software and/or a program **140**. The program **140** includes, for example, a kernel **141**, middleware **143**, an application programming interface (API) **145**, and/or an application program (or "application") **147**. At least a portion of the kernel **141**, middleware **143**, or API **145** may be denoted an operating system (OS).

The kernel **141** can control or manage system resources (such as the bus **110**, processor **120**, or memory **130**) used to perform operations or functions implemented in other programs (such as the middleware **143**, API **145**, or application **147**). The kernel **141** provides an interface that allows the middleware **143**, the API **145**, or the application **147** to access the individual components of the electronic device **101** to control or manage the system resources. The application **147** includes one or more applications for image processing (such as to perform combined intraband and interband multi-frame demosaicing and/or to perform interband denoising and interband sharpening) as discussed below. These functions can be performed by a single application or by multiple applications that each carries out one or more of these functions. The middleware **143** can function as a relay to allow the API **145** or the application **147** to communicate data with the kernel **141**, for instance. A plurality of applications **147** can be provided. The middleware **143** is able to control work requests received from the applications **147**, such as by allocating the priority of using the system resources of the electronic device **101** (like the bus **110**, the processor **120**, or the memory **130**) to at least one of the plurality of applications **147**. The API **145** is an interface allowing the application **147** to control functions provided from the kernel **141** or the middleware **143**. For example, the API **145** includes at least one interface or function (such as a command) for filing control, window control, image processing, or text control.

The I/O interface **150** serves as an interface that can, for example, transfer commands or data input from a user or other external devices to other component(s) of the electronic device **101**. The I/O interface **150** can also output commands or data received from other component(s) of the electronic device **101** to the user or the other external device.

The display **160** includes, for example, a liquid crystal display (LCD), a light emitting diode (LED) display, an organic light emitting diode (OLED) display, a quantum-dot light emitting diode (QLED) display, a microelectromechanical systems (MEMS) display, or an electronic paper display. The display **160** can also be a depth-aware display, such as a multi-focal display. The display **160** is able to display, for example, various contents (such as text, images, videos, icons, or symbols) to the user. The display **160** can include a touchscreen and may receive, for example, a touch, gesture, proximity, or hovering input using an electronic pen or a body portion of the user.

The communication interface **170**, for example, is able to set up communication between the electronic device **101** and an external electronic device (such as a first electronic device **102**, a second electronic device **104**, or a server **106**). For example, the communication interface **170** can be connected with a network **162** or **164** through wireless or wired communication to communicate with the external electronic device. The communication interface **170** can be a wired or wireless transceiver or any other component for transmitting and receiving signals, such as images.

The electronic device **101** further includes one or more sensors **180** that can meter a physical quantity or detect an activation state of the electronic device **101** and convert metered or detected information into an electrical signal. For

example, one or more sensors **180** include one or more cameras or other imaging sensors, which may be used to capture images of scenes. The sensor(s) **180** can also include one or more buttons for touch input, one or more microphones, a gesture sensor, a gyroscope or gyro sensor, an air pressure sensor, a magnetic sensor or magnetometer, an acceleration sensor or accelerometer, a grip sensor, a proximity sensor, a color sensor (such as an RGB sensor), a bio-physical sensor, a temperature sensor, a humidity sensor, an illumination sensor, an ultraviolet (UV) sensor, an electromyography (EMG) sensor, an electroencephalogram (EEG) sensor, an electrocardiogram (ECG) sensor, an infrared (IR) sensor, an ultrasound sensor, an iris sensor, or a fingerprint sensor. The sensor(s) **180** can further include an inertial measurement unit, which can include one or more accelerometers, gyroscopes, and other components. In addition, the sensor(s) **180** can include a control circuit for controlling at least one of the sensors included here. Any of these sensor(s) **180** can be located within the electronic device **101**.

The first external electronic device **102** or the second external electronic device **104** can be a wearable device or an electronic device-mountable wearable device (such as an HMD). When the electronic device **101** is mounted in the electronic device **102** (such as the HMD), the electronic device **101** can communicate with the electronic device **102** through the communication interface **170**. The electronic device **101** can be directly connected with the electronic device **102** to communicate with the electronic device **102** without involving with a separate network. The electronic device **101** can also be an augmented reality wearable device, such as eyeglasses, that include one or more cameras.

The wireless communication is able to use at least one of, for example, long term evolution (LTE), long term evolution-advanced (LTE-A), 5th generation wireless system (5G), millimeter-wave or 60 GHz wireless communication, Wireless USB, code division multiple access (CDMA), wideband code division multiple access (WCDMA), universal mobile telecommunication system (UMTS), wireless broadband (WiBro), or global system for mobile communication (GSM), as a cellular communication protocol. The wired connection can include, for example, at least one of a universal serial bus (USB), high definition multimedia interface (HDMI), recommended standard 232 (RS-232), or plain old telephone service (POTS). The network **162** includes at least one communication network, such as a computer network (like a local area network (LAN) or wide area network (WAN)), Internet, or a telephone network.

The first and second external electronic devices **102** and **104** and server **106** each can be a device of the same or a different type from the electronic device **101**. According to certain embodiments of this disclosure, the server **106** includes a group of one or more servers. Also, according to certain embodiments of this disclosure, all or some of the operations executed on the electronic device **101** can be executed on another or multiple other electronic devices (such as the electronic devices **102** and **104** or server **106**). Further, according to certain embodiments of this disclosure, when the electronic device **101** should perform some function or service automatically or at a request, the electronic device **101**, instead of executing the function or service on its own or additionally, can request another device (such as electronic devices **102** and **104** or server **106**) to perform at least some functions associated therewith. The other electronic device (such as electronic devices **102** and **104** or server **106**) is able to execute the requested functions or additional functions and transfer a result of the execution to the electronic device **101**. The electronic device **101** can provide a requested function or service by processing the received result as it is or additionally. To that end, a cloud computing, distributed computing, or client-server computing technique may be used, for example. While FIG. **1** shows that the electronic device **101** includes the communication interface **170** to communicate with the external electronic device **104** or server **106** via the network **162**, the electronic device **101** may be independently operated without a separate communication function according to some embodiments of this disclosure.

The server **106** can include the same or similar components as the electronic device **101** (or a suitable subset thereof). The server **106** can support to drive the electronic device **101** by performing at least one of operations (or functions) implemented on the electronic device **101**. For example, the server **106** can include a processing module or processor that may support the processor **120** implemented in the electronic device **101**. In some cases, the server **106** can receive image data captured by at least one imaging sensor and process the image data to perform combined intraband and interband multi-frame demosaicing. In other cases, the server **106** can receive image data captured by at least one imaging sensor and process the image data to perform interband denoising and interband sharpening. In still other cases, the server **106** can receive image data captured by at least one imaging sensor and process the image data to perform combined intraband and interband multi-frame demosaicing and to perform interband denoising and interband sharpening.

Although FIG. **1** illustrates one example of a network configuration **100** including an electronic device **101**, various changes may be made to FIG. **1**. For example, the network configuration **100** could include any number of each component in any suitable arrangement. In general, computing and communication systems come in a wide variety of configurations, and FIG. **1** does not limit the scope of this disclosure to any particular configuration. Also, while FIG. **1** illustrates one operational environment in which various features disclosed in this patent document can be used, these features could be used in any other suitable system.

FIG. **2** illustrates an example image processing architecture **200** that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure. For ease of explanation, the image processing architecture **200** shown in FIG. **2** is described as involving the use of the electronic device **101** in the network configuration **100** of FIG. **1**. However, the image processing architecture **200** shown in FIG. **2** could be used with any other suitable device and in any other suitable system, such as when the image processing architecture **200** is executed or supported by the server **106**.

As shown in FIG. **2**, the image processing architecture **200** operates to receive input image frames **202** and generate final images **204**. The input image frames **202** generally represent captured images of scenes, such as Bayer, RGBW, or other image frames captured using a color filter array. In some embodiments, a group of related input image frames **202** may be received and processed, such as when a user triggers an image capture operation of the electronic device **101** and one or more imaging sensors **180** capture multiple images of the same scene at or near the same time. Also, in some embodiments, the input image frames **202** may include image frames captured using different exposures, such as

when the input image frames **202** include one or more shorter-exposure image frames (which may include little or no motion blur) and one or more longer-exposure image frames (which may include more motion blur). As a particular example, the input image frames **202** may include one or more image frames captured at an "EV−0" or auto-exposure level, one or more image frames captured at an "EV−1" or other shorter exposure level (compared to the "EV−0" level), and one or more image frames captured at an "EV+1" or other longer exposure level (compared to the "EV−0" level). In some cases, each input image frame **202** may be divided into multiple channels of data, such as when each input image frame **202** includes red, green, and blue (and optionally white) channels of image data. In particular embodiments, each channel of each input image frame **202** may include twelve-bit image data values associated with a specific color spectrum. The final images **204** generally represent images of scenes that are generated by the image processing architecture **200** based on the input image frames **202**. Each input image frame **202** and each final image **204** may have any suitable resolution, which may vary based on (among other things) the imaging sensor(s) **180** being used.

In this example, a set of multiple input image frames **202** is provided to an alignment function **206**, which generally operates to determine how one or more of the input image frames **202** would need to be warped in order to align one or more features of the input image frames **202**. For example, the alignment function **206** may select a reference image frame from among the set of input image frames **202**, such as by selecting the input image frame **202** with a specified exposure level (like an "EV−0" or other exposure level). The one or more other input image frames **202** that are not selected as the reference image frame may be referred to as one or more "non-reference" image frames. The alignment function **206** can also determine how the one or more non-reference image frames would need to be warped or otherwise modified in order to more closely align one or more features in the non-reference image frame(s) with one or more corresponding features in the reference image frame. In some embodiments, the alignment function **206** generates a warp or alignment map for each non-reference image frame, where each warp or alignment map includes or is based on one or more motion vectors that identify how the position(s) of the one or more specific features in the associated non-reference image frame should be altered in order to be in the position(s) of the same feature(s) in the reference image frame. Alignment may be needed in order to compensate for misalignment caused by the electronic device **101** moving or rotating in between image captures, which causes objects in the input image frames **202** to move or rotate slightly (as is common with handheld devices). The alignment function **206** may use any suitable technique for image alignment, which is also sometimes referred to as image registration. In some cases, the input image frames **202** can be aligned both geometrically and photometrically. In particular embodiments, the alignment function **206** can use global Oriented FAST and Rotated BRIEF (ORB) features and local features from a block search to identify how to align the image frames, although other implementations of the alignment function **206** could also be used.

The input image frames **202** and the warp or alignment maps or other outputs generated by the alignment function **206** are provided to an intraband demosaic-warp function **208**, which generally operates to warp one or more of the input image frames **202** so that the contents of the input image frames **202** are more closely aligned. The demosaic-warp function **208** also performs an intraband demosaic operation that processes the input image frames **202** (or the aligned versions thereof) to produce RGB input image frames in which missing data in the input image frames' various color channels is reconstructed. The intraband demosaicing operation here can convert image data (such as from Bayer or RGBW data to RGB data) and/or perform image scaling or resizing. Each RGB input image frame that is generated by the demosaic-warp function **208** corresponds to one of the input image frames **202**, so the demosaic-warp function **208** can generate a set of RGB input image frames based on the set of input image frames **202**. Each RGB input image frame includes complete image data in multiple color channels (the red, green, and blue color channels) and may include one or more channels that have been subjected to low-pass filtering as described below. In particular embodiments, each RGB input image frame may include between four and six channels (depending on the input image frames **202**), and each channel of each RGB input image frame may include twelve-bit image data values. Example embodiments and operations of the demosaic-warp function **208** are provided below.

The RGB input image frames generated by the demosaic-warp function **208** may be provided to an equalization function **210**, which generally operates to substantially equalize the brightness levels of the RGB input image frames in order to produce equalized RGB input image frames. For example, as noted above, different ones of the input image frames **202** may be captured using different exposures, such as when different input image frames **202** are captured using the EV−1, EV+0, and EV+1 exposures (although other or additional exposure levels may be used). The equalization function **210** can adjust the brightness of one or more of the RGB input image frames generated by the demosaic-warp function **208** so that the equalized RGB input image frames have substantially equal brightness. In some embodiments, for instance, the equalization function **210** may increase the brightness of one or more RGB input image frames having a shorter exposure in order to more closely match the brightness of one or more RGB input image frames having a longer exposure and/or decrease the brightness of one or more RGB input image frames having a longer exposure in order to more closely match the brightness of one or more RGB input image frames having a shorter exposure. The equalization function **210** may use any suitable technique to equalize image frames captured at different exposures. In particular embodiments, each channel of each equalized RGB input image frame generated by the equalization function **210** may include sixteen-bit image data values.

The equalized RGB input image frames generated by the equalization function **210** are blended, which in this example occurs using a single-exposure blending function **212** and a multi-exposure blending function **214**. For example, the single-exposure blending function **212** may be used to blend equalized RGB input image frames that were captured at the same exposure level to produce blended image frames. As a particular example, the single-exposure blending function **212** may blend equalized RGB input image frames captured at the EV−1 exposure, blend equalized RGB input image frames captured at the EV−0 exposure, and/or blend equalized RGB input image frames captured at the EV+1 exposure. Note that, if a single image frame was captured at a specified exposure level, no single-exposure blending may be needed. Also note that the number of blended image frames produced here can depend on various factors, such as the number of exposure levels used

to capture the input image frames **202** and whether multiple image frames were captured at each exposure level. The multi-exposure blending function **214** can blend the blended image frames produced by the single-exposure blending function **212** (possibly along with any unblended image frames that were not blended by the single-exposure blending function **212**) in order to generate blended RGB image frames. In some cases, the blended RGB image frames may represent HDR image frames, which represent blended versions of the image frames input to the multi-exposure blending function **214** but which have a larger dynamic range than any individual image frame input to the multi-exposure blending function **214**.

The single-exposure blending function **212** and the multi-exposure blending function **214** may each use any suitable technique to blend or otherwise combine multiple image frames. As noted above, even though each RGB input image frame produced by the demosaic-warp function **208** may include aliasing artifacts, the process of blending multiple image frames (possibly across multiple exposure levels) can help to reduce or eliminate the aliasing artifacts in the blended image frames. This can be particularly useful when the aliasing may be modeled as a zero-mean random process, so blending over multiple image frames tends to average the aliasing artifacts back to a mean of zero. Note that while two separate blending functions **212** and **214** are shown here, any other suitable blending function or functions may be used to blend the equalized RGB input image frames generated by the equalization function **210**.

The blended RGB image frames generated by the blending functions **212** and **214** are provided to an interband denoising function **216**, which generally operates to reduce noise in the blended RGB image frames in order to produce denoised RGB image frames. For example, the interband denoising function **216** may be used to remove sampling, interpolation, and aliasing artifacts and noise in subsampled image color channels (namely the red and blue channels) using information from at least one higher-sampled color channel (namely the green channel and/or the white channel). This improves the quality of the subsampled color channels based on the color channel(s) having a higher sampling rate, which helps to equalize the signal quality across all of the color channels. Example embodiments and operations of the interband denoising function **216** are provided below.

The denoised RGB image frames generated by the interband denoising function **216** are provided to an interband sharpening function **218**, which generally operates to add details into the subsampled color channels (namely the red and blue channels) using at least one higher-sampled color channel (namely the green channel and/or the white channel) in order to generate sharpened RGB image frames. For example, in some cases, this is accomplished using kernel-adaptive high-pass signals from the higher-sampled color channel(s). This allows the interband sharpening function **218** to adapt to the specific nature of the high-frequency content in the primary color channel(s) in order to naturally add details to the secondary color channels without producing halo artifacts. Example embodiments and operations of the interband sharpening function **218** are provided below.

The sharpened RGB image frames generated by the interband sharpening function **218** are provided to an interband demosaic function **220**, which generally operates to substantially equalize high-frequency content in the various color channels of the sharpened RGB image frames in order to generate equalized sharpened RGB image frames. For example, the interband demosaic function **220** can equalize the high-frequency content in the red, green, and blue channels of each sharpened RGB image frame in order to generate a corresponding equalized sharpened RGB image frame. In some cases, the interband demosaic function **220** may identify one or more areas of image frames associated with motion within a scene being imaged. During prior blending operations, blending may be avoided in one or more areas of a scene in which there is at least some threshold amount of motion, such as an object moving within the scene. Attempting to blend these areas of image frames may result in motion blur, so the prior blending operations may extract at least a portion of an image frame (such as from the image frame having the least amount of motion) and use that portion of the image frame without blending. In those cases, the interband demosaic function **220** can help to remove aliasing that is present as a result. In particular embodiments, each equalized sharpened RGB image frame generated by the interband demosaic function **220** may include three channels (red, green, and blue), and each of these channels may include sixteen-bit image data values. Example embodiments and operations of the interband demosaic function **220** are provided below.

The equalized sharpened RGB image frames generated by the interband demosaic function **220** may undergo one or more post-processing operations, such as by being processed by a tone-mapping function **222** and/or one or more other post-processing functions **224**, in order to generate the final images **204**. For example, the tone-mapping function **222** may convert the high dynamic range of the equalized sharpened RGB image frames into a more displayable range, such as one with an eight-bit depth. This may be done to increase the contrast of the equalized sharpened RGB image frames and produce higher-contrast RGB image frames, which may be further processed by the one or more other post-processing functions **224**. The one or more other post-processing functions **224** may involve any other suitable image processing operations, such as an additional noise reduction operation and/or an edge sharpening operation.

The image processing architecture **200** shown in FIG. **2** may provide various advantages or benefits depending on the implementation. For example, the use of multi-frame blending with combined intraband and interband demosaicing may allow for images of scenes to be generated with fewer or no aliasing artifacts caused by the demosaicing. The intraband demosaicing can be performed prior to blending, which allows aliasing artifacts generated during the intraband demosaicing to be substantially reduced or eliminated during the subsequent blending. The interband demosaicing can be performed after blending to help resolve certain non-uniformities remaining in the image data. Overall, this allows demosaicing to occur while reducing or eliminating aliasing artifacts caused by the demosaicing. Moreover, the use of multi-frame blending with interband denoising and interband sharpening can substantially equalize the signal quality across the different color channels of blended image frames and add image details without creating halos. This can significantly increase the overall image quality of the final images **204**.

It should be noted that the functions shown in or described with respect to FIG. **2** can be implemented in an electronic device **101**, server **106**, or other device in any suitable manner. For example, in some embodiments, at least some of the functions shown in or described with respect to FIG. **2** can be implemented or supported using one or more software applications or other software instructions that are executed by the processor **120** of the electronic device **101**, server **106**, or other device. In other embodiments, at least

some of the functions shown in or described with respect to FIG. **2** can be implemented or supported using dedicated hardware components. In general, the functions shown in or described with respect to FIG. **2** can be performed using any suitable hardware or any suitable combination of hardware and software/firmware instructions.

Although FIG. **2** illustrates one example of an image processing architecture **200** that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening, various changes may be made to FIG. **2**. For example, various functions shown in FIG. **2** may be combined, further subdivided, replicated, omitted, or rearranged and additional functions may be added according to particular needs. Also, as noted above, it is assumed here that both (i) combined intraband and interband multi-frame demosaicing and (ii) interband denoising and interband sharpening may be used together in the same image processing architecture **200**. However, the image processing architecture **200** may support one of these functionalities and not the other.

FIG. **3** illustrates an example demosaic-warp function **208** and example interactions between the demosaic-warp function **208**, the single-exposure blending function **212**, and the multi-exposure blending function **214** in the image processing architecture **200** of FIG. **2** according to this disclosure. As shown in FIG. **3**, the demosaic-warp function **208** can receive a reference image frame **302** and at least one non-reference image frame **304** as inputs. The reference image frame **302** can represent the input image frame **202** selected by the alignment function **206** to be the reference frame, and the at least one non-reference image frame **304** can represent at least one input image frame **202** not selected by the alignment function **206** to be the reference frame. The demosaic-warp function **208** also receives one or more alignment maps **306** from the alignment function **206** as inputs. Each alignment map **306** can identify how at least one of the image frames **302**, **304** may be warped in order to more closely align one or more features contained in the image frames **302**, **304**.

In this example, the demosaic-warp function **208** is implemented using warp and interpolation functions **308** and **310**. The reference image frame **302** is processed using the warp and interpolation function **308**, and each non-reference image frame **304** is processed using the warp and interpolation function **310**. Each of the warp and interpolation functions **308** and **310** is configured to perform intraband joint demosaicing and warping operations respectively using the image frames **302** and **304**. In some cases, the warp and interpolation functions **308**, **310** may operate in parallel in order to process different image frames **302**, **304** at the same time. In other cases, the warp and interpolation functions **308**, **310** may operate serially in order to process different image frames **302**, **304** sequentially, in which case there may be only one instance of the warp and interpolation function **308** or **310**.

Each warp and interpolation function **308**, **310** generally operates to warp one or more of the image frames **302**, **304** so that one or more features contained in the image frames **302**, **304** are more closely aligned. As a particular example, the warp and interpolation functions **308**, **310** may warp one or more of the image frames **302**, **304** so that one or more objects captured in the image frames **302**, **304** are located at substantially the same position(s) in the warped versions of the image frames **302**, **304**. Depending on the implementation, only the non-reference image frame(s) **304** may be warped for this purpose, or both the reference image frame **302** and the non-reference image frame(s) **304** may be warped for this purpose.

Each warp and interpolation function **308**, **310** also generally operates to interpolate image data in order to reconstruct full single-color spectrum image frames. This allows each warp and interpolation function **308**, **310** to implement intraband joint demosaicing and warping. As noted above, the image frames **302**, **304** may be generated using a color filter array. As a result, each image frame **302**, **304** may be associated with multiple single-color spectrum channels, and each pixel of each image frame **302**, **304** may be associated with a single color spectrum. Each warp and interpolation function **308**, **310** can therefore perform interpolation operations in order to estimate image data for all of the color spectra at each pixel of the image frames **302**, **304**. For instance, each warp and interpolation function **308**, **310** can perform interpolation using red image data to estimate red values across all pixels of the image frames **302**, **304**, perform interpolation using green image data to estimate green values across all pixels of the image frames **302**, **304**, and perform interpolation using blue image data to estimate blue values across all pixels of the image frames **302**, **304**. The warp and interpolation functions **308**, **310** thereby generate RGB input image frames **312** and **314**, which respectively represent multi-channel full-size RGB versions of the reference and non-reference image frames **302**, **304**.

In this example, the RGB input image frames **312** and **314** are converted into the YUV domain and provided to a deghosting function **316**. The YUV domain represents image data using luminance or luma values (Y) and chrominance values (U and V). The conversion to the YUV domain may be performed by the deghosting function **316** itself or by a function that receives and converts the RGB input image frames **312** and **314** into YUV image data. The deghosting function **316** generally operates to identify motion in a scene that is captured by the image frames **302** and **304**. For example, the deghosting function **316** may compare the YUV version of each RGB input image frame **314** (which is associated with a non-reference image frame **304**) to the YUV version of the RGB input image frame **312** (which is associated with the reference image frame **302**) in order to identify any area(s) of the non-reference image frame **304** differing by at least a threshold amount or percentage compared to the same area(s) of the reference image frame **302**. When motion is present in at least a portion of the scene being captured, blending of multiple image frames in at least that portion of the scene may be avoided in order to reduce or prevent the creation of motion blur (which is also called ghosting). In some cases, the deghosting function **316** can generate at least one weight map **318** that identifies how two or more image frames are to be blended, such as when a weight map **318** includes values that indicate a weight to be applied to one or more of the RGB input image frames **312** and **314** during blending. If motion is detected in a specific area of a scene, the weight map **318** may indicate that, during blending, most or all of the image content for that specific area of the scene should come from a single RGB input image frame **312** or **314** (such as the RGB input image frame **312** or **314** captured using the shortest exposure). The deghosting function **316** may use any suitable technique to identify how to blend multiple image frames to reduce or avoid the creation of motion blur.

The RGB input image frames **312** and **314** and the at least one weight map **318** are provided to a blending function **320**, which blends the RGB input image frames **312** and **314**

based on the weights contained in the weight map(s) **318**. The blending function **320** may use any suitable technique to blend image frames. In some embodiments, the blending function **320** may represent the single-exposure blending function **212** and the multi-exposure blending function **214** described above (in which case the equalization function **210** may be performed prior to the blending function **320**). The blending here results in the creation of blended RGB image frames **322**, which may represent the image frames that are provided to the interband denoising function **216**. In some cases, each blended RGB image frame **322** may represent an HDR image frame, which may be produced when image frames captured at different exposure levels are blended to thereby increase the dynamic range of the blended RGB image frame **322**.

Note that intraband demosaicing is occurring here with multiple image frames **302**, **304** and that the resulting RGB input image frames **312**, **314** are then blended. The blending of multiple image frames helps to reduce noise, and the blending of multiple image frames after intraband demosaicing has occurred helps to reduce or eliminate any aliasing artifacts that are generated by the demosaicing process. This can result in significantly better image quality compared to other approaches.

FIG. **4** illustrates an example warp and interpolation function **308** in the demosaic-warp function **208** of FIG. **3** according to this disclosure. In some embodiments, the warp and interpolation function **308** may be implemented using a kernel-adaptive approach in which filtering operations are performed using filters (also called kernels) that are selected based on the image content of the image frames **302** being processed. As shown in FIG. **4**, the warp and interpolation function **308** receives a reference image frame **302** as input. The image frame **302** is provided to a white (W)-guided image structure generation function **402**, which generally operates to produce a single-channel image frame that contains structural information about the scene being captured in the image frame **302**. For example, the structural information may represent information such as the locations and edges of one or more objects (and possibly numerous objects) captured in the scene. Example embodiments and operations of the W-guided image structure generation function **402** are provided below.

A gradient structure tensor function **404** processes the single-channel image frame generated by the W-guided image structure generation function **402** in order to identify one or more characteristics of the structural information contained in the single-channel image frame. For example, in some embodiments, the gradient structure tensor function **404** may identify gradients in the single-channel image frame (such as in the x and y directions) and identify gradient strength, coherence, and orientation estimates at various locations in the single-channel image frame. In some cases, the gradient structure tensor function **404** may identify gradient strength, coherence, and orientation estimates for each pixel of the single-channel image frame. A gradient strength estimate generally identifies whether image content around a specific location in an image frame is associated with a gradient and may therefore be associated with an object edge in a scene. The gradient strength estimate can be higher around edges of objects and lower in flat areas of the image frame. A coherence estimate generally identifies whether stronger gradients around a specific location in an image frame have similar orientation, and coherence estimates can be used to separate areas of an image frame with stronger gradients that are not oriented in any particular direction from areas of an image frame with stronger gradients that are oriented in a particular direction. The coherence estimate may be lower to indicate textured areas of an image frame and higher to indicate at least one oriented edge in an image frame. The orientation estimate generally identifies a measure of an angle of orientation for one or more gradients, so the orientation estimate may be used to identify if (and in what direction) one or more gradients are oriented. Example operations of the gradient structure tensor function **404** are provided below.

The outputs generated by the gradient structure tensor function **404** are provided to a kernel selection function **406**, which generally operates to select specific kernels for filters **408-414** to be used to filter the image frame **302**. The filters **408-414** here may be used to warp and/or interpolate the image data contained in the image frame **302**. For example, the kernel selection function **406** may use the orientation, strength, and coherence estimates of image content in the image frame **302** to select appropriate kernels for a red filter **408**, a green filter **410**, a blue filter **412**, and optionally a white filter **414** for use in filtering the image data of the image frame **302**. Note that two or more of the filters **408-414** may use a common kernel and/or two or more of the filters **408-414** may use different kernels. Also note that different kernels can be used by the filters **408-414** to filter different portions of the image frame **302**, such as based on different image content contained in the different portions of the image frame **302**. In some embodiments, the kernel selection function **406** may have access to at least one kernel bank that includes a number of predefined filter kernels that can be used to filter image data, and the kernels selected for use by the filters **408-414** may be selected from the bank based on the orientation, strength, and coherence estimates of the image content in the image frame **302**. Each filter **408-414** represents any suitable type of filter configured to filter image data. In some cases, each filter **408-414** may represent a bilateral interpolation filter, which may include both spatial and range (pixel-difference) weighting.

The filters **408-414** here generally operate to produce various outputs **416**, such as red, green, blue, and optionally white channels of image data (which can collectively form an RGB input image frame **312**). In some embodiments, the filters **410** and **414** may each incorporate or include a low-pass filter kernel, which may generate a low-pass green (G_{LP}) channel and/or a low-pass white (W_{LP}) channel in the outputs **416**. One or both of these low-pass channels may be provided to and used by the interband sharpening function **218** as described below. Also, since the filtering of the white channel is optional, the warp and interpolation function **308** may only filter the red, green, and blue channels to produce the outputs **416** in other embodiments. Further, in some cases, each warp and interpolation function **310** may include only the filters **408-414** and be used to filter image data of a non-reference image frame **304** to produce an RGB input image frame **314**. In those cases, the kernels used in the filters **408-414** for the non-reference image frame(s) **304** may be selected by the kernel selection function **406** used to select the filters **408-414** for the reference image frame **302**. In addition, the filters **410** and **414** for the non-reference image frame(s) **304** may not produce the green and white low-pass channels.

FIG. **5** illustrates an example W-guided image structure generation function **402** in the warp and interpolation function **308** of FIG. **4** according to this disclosure. As noted above, the W-guided image structure generation function **402** generates a single-channel image frame containing structural information about a scene as captured in an image frame **302**. In this example, the image frame **302** is provided

to a frequency-based demosaic function **502**, which generally operates to perform interpolations in order to reconstruct image data that is missing due to the use of a color filter array. In some embodiments, for instance, the frequency-based demosaic function **502** may perform a simple interpolation by convolving neighboring pixel values with a separable low-pass filter. In some cases, this convolution may be expressed as follows:

$$W_{interp}=W\times(H\times 1/2) \tag{1}$$

$$G_{interp}=G\times(H\times 1) \tag{2}$$

$$R_{interp}=R\times(H\times 2) \tag{3}$$

$$B_{interp}=B\times(H\times 2) \tag{4}$$

Here, R, G, B, and W represent original image data values from an image frame **302**. Also, R_{interp}, G_{interp}, B_{interp}, and W_{interp} represent interpolated data values generated by the frequency-based demosaic function **502**. In addition, H represents the separable low-pass filter used by the frequency-based demosaic function **502**. As a particular example, the separable low-pass filter used by the frequency-based demosaic function **502** may be defined using a one-dimensional (1D) array of values having the following form: [−0.0121, 0.0750, 0.2621, 0.3500, 0.2621, 0.0750, −0.0121]. The frequency-based demosaic function **502** generates a multi-channel image frame **504**, such as an RGBW image frame.

A gamma curve with initial linearity function **506** applies gamma correction to the multi-channel image frame **504** in order to brighten image contents while avoiding the amplification of dark-area noise in the multi-channel image frame **504**. Gamma correction typically occurs by applying a nonlinear function to image data. The gamma curve with initial linearity function **506** here supports the use of gamma correction where a portion of the gamma curve is linear, which helps to avoid amplifying dark-area noise. The remainder of the gamma curve may be nonlinear, which allows for the brightening of other image contents. This results in a corrected multi-channel image frame, where the corrected multi-channel image frame **504** includes RGB channels **508** and a white channel **510**.

The RGB channels **508** are provided to an RGB-to-Y conversion function **512**, which generally operates to convert the RGB data into luminance or luma data (Y). The RGB-to-Y conversion function **512** may use any suitable technique to convert RGB data into Y data. In some embodiments, the RGB-to-Y conversion function **512** calculates Y data values from RGB data values as follows:

$$Y=0.2126\times R'+0.7152\times G'+0.0722\times B' \tag{5}$$

Here, R', G', and B' respectively represent red, green, and blue data values as output from the gamma curve with initial linearity function **506**. The RGB-to-Y conversion function **512** here generates data in a Y channel **514**, which is provided (along with the white channel **510**) to a brightness equalization function **516**.

Since the white channel **510** can have a different brightness level compared to the RGB channels **508** and the Y channel **514**, the brightness equalization function **516** generally operates to equalize the brightness level of the white channel **510**. The brightness equalization function **516** may use any suitable technique to equalize the brightness level of the white channel **510**. In some embodiments, the brightness equalization function **516** calculates equalized white data values (W_{eq}) as follows:

$$W_{eq}=W^{\gamma} \tag{6}$$

where:

$$\gamma=\log(Y_{median})/\log(W_{median}) \tag{7}$$

Here, Y_{median} and W_{median} respectively represent the median value of the Y channel **514** and the median value of the white channel **510**. The brightness equalization function **516** here generates data in an equalized white channel **518**, which is provided (along with the Y channel **514**) to a filtering function **520**.

The filtering function **520** generally operates to filter the Y channel **514** based on the equalized white channel **518**. In some cases, for example, the filtering function **520** may implement a guided filter, which filters the Y channel **514** while using the equalized white channel **518** as a guide map. However, the filtering function **520** may use any other suitable technique to filter image data. The result generated in FIG. **5** is a structure image (Y_F) **522**, which generally represents the structure captured in the image data of the image frame **302**. Here, the structure image **522** may represent the luminance or luma data generated by the RGB-to-Y conversion function **512** and filtered by the filtering function **520**.

The structure image **522** can be provided to the gradient structure tensor function **404**, such as for use in generating orientation, gradient strength, and coherence estimates for the image frame **302**. In some embodiments, for example, a gradient structure tensor G of an image I can be expressed as follows:

$$G=\begin{bmatrix} G_{xx} & G_{xy} \\ G_{xy} & G_{yy} \end{bmatrix} \tag{8}$$

where the components of the gradient structure tensor G can be expressed as follows:

$$G_{xx}=E[I_x^2] \tag{9}$$

$$G_{yy}=E[I_y^2] \tag{10}$$

$$G_{xy}=E[I_xI_y] \tag{11}$$

In the above equations, E[] represents mathematical expectation (which can be approximated by averaging over a local window), and I_x and I_y respectively represent a gradient image with respect to x and y (meaning they are partial derivatives of an image I with respect to x and y). This gradient structure tensor G can be used by the gradient structure tensor function **404** in the following manner. The eigenvalues of the gradient structure tensor G can be determined as follows:

$$\lambda_{1,2}=1/2[G_{xx}+G_{yy}\pm\sqrt{(G_{xx}-G_{yy})^2+4G_{xy}^2}] \tag{12}$$

where λ_1 represents the dominant eigenvalue and λ_2 represents the secondary eigenvalue. With this, the gradient structure tensor function **404** may determine an orientation θ, a coherence C, and a strength S of image data, such as in the following manner:

$$\theta = 0.5 \arctan\frac{2G_{xy}}{G_{yy}-G_{xx}} \tag{13}$$

-continued

$$C = \frac{\lambda_1 - \lambda_2}{\lambda_1 + \lambda_2} \quad (14)$$

$$S = \lambda_1 \quad (15)$$

In particular embodiments, these values may be determined for each point (pixel) of the structure image **522**. Note, however, that the gradient structure tensor function **404** may use any other suitable tensor and determine orientation, strength, and coherence estimates or other characteristics of image data in any other suitable manner.

FIG. **6** illustrates example values that may be generated by the gradient structure tensor function **404** in the warp and interpolation function **308** of FIG. **4** according to this disclosure. More specifically, FIG. **6** contains a graph **600** identifying orientation estimates, a graph **602** identifying strength estimates, and a graph **604** identifying coherence estimates for a specific image frame. In this particular example, the estimates are generated for an image frame capturing a flower. As a result, the orientation estimates in the graph **600** tend to indicate that the individual petals are generally flat (have no specific orientation), the strength estimates in the graph **602** tend to identify edges of different petals of the flower, and the coherence estimates in the graph **604** tend to indicate that the edges are often relatively far apart.

In some embodiments, the kernel selection function **406** can use the estimates generated by the gradient structure tensor function **404** to select kernels to be used to filter image data. For example, based on the gradient strength, coherence, and orientation estimates, the kernel selection function **406** may select narrower filters that are not oriented in any particular direction for textured areas of a scene or may select filters with definite orientations for use along edges in the scene. As a particular example, the kernel selection function **406** may select one or more kernels from one or more banks of predefined kernels based on the gradient strength, coherence, and orientation estimates.

FIG. **7** illustrates an example kernel bank **700** that may be used by the kernel selection function **406** in the warp and interpolation function **308** of FIG. **4** according to this disclosure. As shown in FIG. **7**, the bank **700** includes a number of kernels **702**, where each kernel **702** defines how image data can be filtered and where different kernels **702** define different ways in which image data can be filtered. As can be seen here, the kernels **702** tend to get smaller with strength so that edges of objects can be filtered using smaller kernel sizes, while flatter regions in an image frame can be filtered using larger kernel sizes. The kernels **702** also tend to get thinner and more elongated with coherence so that gradients oriented in the same direction can be preserved better during filtering. The directions of the kernels **702** may vary based on the angle of orientation of the gradients so that the filtering can be performed along a gradient's direction of orientation (if there is one). Thus, the kernel selection function **406** can use the gradient strength, coherence, and orientation estimates of image data in order to select appropriate kernels for the filters **408-414** used the filter the image frames **302** and **304**.

Note that while each location in the bank **700** shows a single kernel **702**, it is possible for each location in the bank **700** to include or be associated with multiple kernels **702**. For example, multiple kernels **702** may be associated with the same gradient strength, coherence, and orientation estimates, where different ones of the kernels **702** are used with different ones of the filters **408-414**. When processing Bayer image data, for instance, the green channel can have a different sampling pattern than the red and blue channels, so different kernels may be used with the green filter **410** and with the red and blue filters **408**, **412**. In other cases, there may be multiple banks **700** of kernels **702**, such as one bank **700** per color channel, and kernels **702** may be selected from the appropriate banks **700** for use in the corresponding filters **408-414**.

In some embodiments, the gradient structure tensor function **404** and the kernel selection function **406** may operate as follows. The gradient structure tensor function **404** can select a pixel in the structure image **522**, measure any gradients (such as in the x and y directions) within a small window around the selected pixel, and determine the strength, coherence, and orientation estimates for the selected pixel using the pixel values within the window. Each strength, coherence, and orientation estimate can have a calculated numerical value, and the kernel selection function **406** may use that value to identify one of multiple bins or ranges into which the numerical value falls. The kernel selection function **406** may also use the bin or range for the strength estimate, the bin or range for the coherence estimate, and the bin or range for the orientation estimate to form an index into at least one bank **700**, and the kernel(s) **702** identified by the index may be selected for use in filtering image data. This process can be repeated for some, many, or all pixels in the structure image **522**.

Note that one or more kernels **702** selected for use in filtering a specific portion of an image frame **302** or **304** can be applied independently to the different color channels of the image frame **302** or **304**, so each color channel is filtered independently of the other color channels. Standard demosaicing techniques often simply use the green channel to improve the red and blue channels. However, in embodiments of this disclosure, the color channels are filtered separately to generate independent image frames that can be blended together to reduce or eliminate aliasing artifacts. Again, note that different kernels **702** may be selected for use in filtering different portions of an image frame **302** or **304**, such as when the different portions of the image frame **302** or **304** are associated with different gradient strength, coherency, and orientation estimates (or any subset thereof). This allows individual portions of the image frame **302** or **304** to be filtered more effectively based on the image content of those individual portions.

While the embodiments described above have demonstrated the use of gradient strength, coherence, and orientation estimates to select kernels for use, other or additional considerations may be used when selecting kernels for use. For example, semantic classes refer to classes or types of image content that may be present in a captured image frame of a scene. Examples of semantic classes may include people, animals, trees/shrubs/other foliage, buildings/houses/other structures, the ground, the sky, and water. Semantic classes may be used instead of or in addition to using strength, coherence, and orientation estimates in order to select kernels. As a particular example, a semantic map may be generated for a reference frame or other image frame, where the semantic map estimates the type of image content at each pixel of the image frame. One or more kernels may be selected for use in filtering the image frame based on which type(s) of image content is/are present and where in the image frame. As another example, edge detection may be used to identify edges of objects or scenery within a reference frame or other image frame, and an edge map that identifies the detected edges may be generated. One

or more kernels may be selected based on the edges (or lack thereof) detected within the image frame. In general, any suitable factors or any combinations of suitable factors may be used to select kernels for use in filtering image data.

Returning to FIG. **4**, as noted above, each filter **408-414** may represent a bilateral interpolation filter in some embodiments of the warp and interpolation function **308**, **310**. A bilateral interpolation filter provides an edge-preserving interpolation of pixels in a source image frame (up to an edge definition) in order to fill in a pixel's value in a destination image frame. For the filters **408-414**, each filter **408-414** implemented as a bilateral interpolation filter can provide an edge-preserving interpolation of pixels in a source image frame (the image frame **302** or **304**) in order to fill in each pixel's value in a destination image frame (one of the R, G, B, or W outputs **416**). As a particular example, for a specified color channel (the green channel in this example), a value output by the filter **410** for a pixel with coordinates (p, q) in a destination image frame may expressed as follows:

$$I_G^{BF}(p) = \frac{1}{W(p)} \sum_{q \in w(p)} G_{\sigma_S}(\|p-q\|) G_{\sigma_R}(|I_G(p) - I_G(q)|) I_G(q) \quad (16)$$

Here, G_{σ_S} and G_{σ_R} respectively represent Gaussian weights for space and range, and w represents a weight normalization. Similar expressions may be used for the other filters **408**, **412**, **414** that are implemented as bilateral interpolation filters.

FIG. **8** illustrates example operation **800** of a bilateral interpolation filter **408-414** in the warp and interpolation function **308** of FIG. **4** according to this disclosure. As shown in FIG. **8**, a selected kernel **702** can be applied to an image frame **302**. In this example, the selected kernel **702** is being applied to a window **802** of pixels within the image frame **302**. The window **802** here represents a 7×7 window of pixels, although windows of other sizes may be used. A corresponding window **804** is associated with a destination image frame, and multiple destination image frames may be generated (such as when different destination image frames represent different single-color channel image frames generated in the outputs **416**).

A bilateral interpolation filter can be used to estimate the values at pixel locations within each destination image frame. In FIG. **8**, the bilateral interpolation filter is being used to specifically identify the pixel value within a destination image frame at a specified pixel location **806**. The pixel location **806** is said to reside at coordinates (x, y), where x and y are integer values. The pixel value associated with the pixel location **806** can be determined by interpolating pixel values around a pixel location **808** in the source image frame, where the pixel location **808** is related to the pixel location **806** (such as when both pixel locations **806** and **808** represent the same point of a captured scene). However, the pixel location **808** in the source image frame likely does not have integer coordinates, such as due to the warping needed to align the image frames. The pixel location **808** is said to reside at coordinates (u, v), where u and v are typically non-integer values. Thus, the bilateral interpolation filter may operate as follows.

The alignment function **206** can provide one or more alignment maps as described above, where each alignment map defines how image data should be warped to more closely align one or more features in two or more image frames. In some embodiments, the alignment function **206** can provide (or the demosaic-warp function **208** can calculate) inverse mappings f_x^{-1} and f_y^{-1} that can be used to (among other things) map the pixel location **806** to the pixel location **808**. As a result, when given a pixel location **806** at coordinates (x, y) in the destination image frame, the inverse mappings f_x^{-1} and f_y^{-1} can be used to calculate the coordinates (u, v) of the corresponding pixel location **808** in the source image frame. Once the coordinates (u, v) of the corresponding pixel location **808** are known, the bilateral interpolation filter performs interpolation using one or more neighboring source pixels around the pixel location **808** in order to generate the pixel value for the pixel location **806**. The one or more neighboring source pixels can be included within a specified area **810** around the pixel location **808**, where the specified area **810** is defined by the selected kernel **702**.

Among other things, this approach allows for spatial interpolation that can capture the spatial relationships between a fractional source pixel and its integer neighbors. In some embodiments, the operation **800** of the bilateral interpolation filter as shown in FIG. **8** may be expressed as follows:

```
for (int x = 0; x < xmax; x++) {
  for (int y = 0; y < ymax; y++) {
    float u = f_x^-1 (x, y);
    float v = f_y^-1 (x, y);
    dst(x, y) = resample_src(u, v, w)
  }
}
```

Here, w refers to the radius of the specified area **810**. Also, dst(x, y) refers to the pixel value at the (x, y) pixel location **806**, and resample_src( ) refers to a function that performs an interpolation using pixel values around the (u, v) pixel location **808** within the radius of the specified area **810**. This process may be repeated over all x and y integer values (up to maximum values of xmax and ymax, respectively) in order to produce pixel values for all pixel locations **806** in the window **804**. For each x and y combination identifying a pixel location **806**, the process identifies the u and v coordinates for the corresponding pixel location **808** and performs an interpolation around those u and v coordinates.

In addition to the spatial dimension, a bilateral interpolation filter can consider the range relationship between a fractional source pixel and its integer neighbors. This can help to preserve small edges contained in an image frame **302** or **304** since spatial-only interpolation may tend to leave small edges appearing smudgy. The range relationship considered by the bilateral interpolation filter can be achieved using suitable weights in the interpolation calculations. In general, spatial interpolation of image data can follow an interpolation path P, which in some cases may generally represent a path of decreasing spatial weights. In some embodiments, this can be expressed as follows:

$$w_i \geq w_j, i < j, \forall i,j \in P \quad (17)$$

This indicates that a spatial-only fractional (source) pixel can be estimated by accumulating pixel values $\check{p}$ (of the same type) and weights $\check{w}$ along the path of interpolation P. Note that this path P does not have to be spatially contiguous.

FIGS. **9** and **10** illustrate example interpolation paths **900** and **1000** that may be used by a bilateral interpolation filter **408-414** in the warp and interpolation function **308** of FIG. **4** according to this disclosure. As shown in FIG. **9**, the selected kernel **702** is shown as being positioned behind the

window **802** of pixels within the image frame **302**. The interpolation path **900** shown in FIG. **9** is generally defined as starting from a center of a blob defined by the selected kernel **702** and moving outward, where the center of the blob defined by the selected kernel **702** has a higher spatial weight and positions moving away from the blob defined by the selected kernel **702** generally have lower spatial weights. Using this approach, a partial accumulation up to a location j of a color channel c∈{R,G,B(, W)} (which indicates that the color channel may be the R, G, or B channel or in some cases may be the W channel) along the interpolation path P may be expressed as follows:

$$\widetilde{p_{c,J}} = \Sigma_{i \le j} p_i * w_i, i,j \in P \cap c \tag{18}$$

$$\widetilde{w_{c,J}} = \Sigma_{i \le j} w_i, i,j \in P \cap c \tag{19}$$

Spatial accumulators of the first (highest-weight) t pixels may be used to estimate the reference $\overline{p_{c,t}}$ for range-based weighting, which may be expressed as follows:

$$\overline{p_{c,t}} = \frac{\widetilde{p_{c,t}}}{\widetilde{w_{c,t}}} \tag{20}$$

In some embodiments, the range-based weighting may use a Gaussian model. The combined spatial- and range-based interpolation of the fractional source pixel $\overline{p_c}$ for channel c may therefore be expressed as follows:

$$\breve{p_c} = \widetilde{p_{c,t}} + \sum_{i>t} p_i * w_i * \exp\left(-\frac{(p_i - \overline{p_{c,t}})^2}{2\sigma^2}\right), i \in P \cap c \tag{21}$$

$$\breve{w_c} = \widetilde{w_{c,t}} + \sum_{i>t} w_i * \exp\left(-\frac{(p_i - \overline{p_{c,t}})^2}{2\sigma^2}\right), i \in P \cap c \tag{22}$$

$$\overline{p_c} = \frac{\breve{p_c}}{\breve{w_c}} \tag{23}$$

Note, however, that other interpolation paths may be used by a bilateral interpolation filter. For example, the interpolation path **1000** shown in FIG. **10** begins at the center of the window **802** of pixels and moves in a counter-clockwise swirl pattern from the center of the window **802** to the outer edges of the window **802**. This approach may be simpler than using the interpolation path **900** and may help to avoid the need to sort local pixels within a kernel according to their weights. While the range reference estimate $\overline{p_{c,t}}$ generated using the interpolation path **1000** may contain certain spatial biases, this may be acceptable in some cases (such as when this issue is outweighed by the computational savings).

It should be noted that the functions shown in or described with respect to FIGS. **3** through **10** can be implemented in an electronic device **101**, server **106**, or other device in any suitable manner. For example, in some embodiments, at least some of the functions shown in or described with respect to FIGS. **3** through **10** can be implemented or supported using one or more software applications or other software instructions that are executed by the processor **120** of the electronic device **101**, server **106**, or other device. In other embodiments, at least some of the functions shown in or described with respect to FIGS. **3** through **10** can be implemented or supported using dedicated hardware components. In general, the functions shown in or described with respect to FIGS. **3** through **10** can be performed using any suitable hardware or any suitable combination of hardware and software/firmware instructions.

Although FIGS. **3** through **10** illustrate one example of a demosaic-warp function **208** in the image processing architecture **200** of FIG. **2** and related details, various changes may be made to FIGS. **3** through **10**. For example, various functions shown in FIGS. **3** through **5** may be combined, further subdivided, replicated, omitted, or rearranged and additional functions may be added according to particular needs. Also, the graphs shown in FIG. **6**, the kernel bank shown in FIG. **7**, the interpolation shown in FIG. **8**, and the interpolation paths shown in FIGS. **9** and **10** are examples only and can vary depending on the circumstances. For instance, the graphs of strength, coherence, and orientation estimates can vary based on the actual image frame being processed, the kernels contained in the kernel bank may vary depending on the implementation, and any suitable interpolation path (if any) may be used during an interpolation operation.

FIG. **11** illustrates a first example interband denoising function **216** in the image processing architecture **200** of FIG. **2** according to this disclosure. As shown in FIG. **11**, the interband denoising function **216** can receive blended image frames generated by the single-exposure blending function **212** and the multi-exposure blending function **214**. In this particular example, the interband denoising function **216** receives blended RGB image frames **322** as inputs, where each blended RGB image frame **322** is received in its different color channels (R, G, B, and optionally W). The interband denoising function **216** generally operates to remove aliasing artifacts and noise in subsampled color channels (the red and blue channels) using higher-SNR signals from one or more higher-sampled color channels (such as the green channel and/or the white channel).

In this example, the white and green channels of the blended RGB image frame **322** are provided to a brightness equalization function **1102**, which generally operates to equalize the brightness level of the white channel compared to the green channel. The brightness equalization function **1102** may use any suitable technique to equalize the brightness level of the white channel. In some embodiments, the brightness equalization function **1102** calculates equalized white data values (W_{eq}') as follows:

$$W_{eq}' = W^{\gamma'} \tag{24}$$

where:

$$\gamma' = \log(G_{median})/\log(W_{median}) \tag{25}$$

Here, G_{median} and W_{median} respectively represent the median value of the green channel of the blended RGB image frame **322** and the median value of the white channel of the blended RGB image frame **322**. The brightness equalization function **1102** here generates data in an equalized white channel **1104**, which is provided (along with the G channel) to a filtering function **1106**.

The filtering function **1106** generally operates to filter the green channel of the blended RGB image frame **322** based on the equalized white channel **1104**. In some cases, the filtering function **1106** may be implemented using a guided filter, which filters the green channel of the blended RGB image frame **322** while using the equalized white channel

1104 as a guide map. However, the filtering function **1106** may use any other suitable technique to filter image data. The filtering function **1106** thereby generates a filtered version of the green channel as a green-white (GW) channel **1108**. In other embodiments, the brightness equalization function **1102** and the filtering function **1106** may be omitted if the blended RGB image frame **322** includes RGB channels only (and not a white channel).

Three additional filtering functions **1110**, **1112**, and **1114** are respectively used to filter the green, red, and blue channels of the blended RGB image frame **322**. In some cases, each filtering function **1110**, **1112**, and **1114** may be implemented using a guided filter. However, each filtering function **1110**, **1112**, and **1114** may use any other suitable technique to filter image data. For the green channel, the filtering function **1110** when implemented using a guided filter may perform a self-guided denoise operation (if the white channel is not present) or perform sampling/interpolation/aliasing removal using the GW channel **1108** as a guide map. Each filtering function **1112** and **1114** when implemented using a guided filter may function as a three-channel guided filter, where a combination of the GW channel **1108** and the red and blue channels of the blended RGB image frame **322** is used as a guide map. In this example, a concatenation function **1116** can combine the GW channel **1108** with the red and blue channels of the blended RGB image frame **322** to produce a guide map **1118** used by the filtering functions **1112** and **1114**. This allows guided filtering to be applied to the red and blue channels using a single-channel fusion of the GW channel **1108** and the red and blue channels. Among other things, this can help to ensure that chroma edges are optimally preserved during the filtering process. The filtering functions **1110**, **1112**, and **1114** here generate outputs **1120**, which represent denoised versions of the red, green, and blue channels of each blended RGB image frame **322**. These outputs **1120** may therefore represent the denoised RGB image frames provided to the interband sharpening function **218**.

As noted above, in some embodiments, each of the filtering functions **1106** and **1110** may be implemented using a guided filter. In some embodiments, each of these guided filters may be based on a local linear model between a filtering output q and a guidance image I at every pixel i. This may be expressed as follows:

$$q_i = a_k I_i + b_k, \forall i \in w_k \tag{26}$$

where a_k and b_k represent linear coefficients to be optimized for a local window w_k centered at pixel k. The filtering output can be optimized to be closest to an input image p in mean-square sense. In some cases, the linear coefficients can be expressed as follows:

$$a_k = \frac{\frac{1}{|w_k|}\Sigma_i I_i p_i - \bar{I}_i \bar{p}_i}{\sigma_k^2 + \varepsilon} \tag{27}$$

$$b_k = \bar{p}_k - a_k \bar{I}_k \tag{28}$$

where σ_k^2 represents the local variance of the guidance image I in the local window w_k.

Also, as noted above, in some embodiments, each of the filtering functions **1112** and **1114** may be implemented using a three-channel guided filter. In some embodiments, each of these three-channel guided filters may represent an extension of a guided filter, where the guidance image I has three channels. In some cases, the operation of each three-channel guided filter may be expressed as follows:

$$q_i = a_k^T I_i + b_k, \forall i \in w_k \tag{29}$$

$$a_k = (\Sigma_k + \epsilon U)^{-1}\left(\frac{1}{|w_k|}\sum_i I_i p_i - \bar{I}_i \bar{p}_i\right) \tag{30}$$

$$b_k = \bar{p}_k - a_k^T \bar{I}_k \tag{31}$$

where Σ_k represents a 3×3 covariance matrix of the guidance image I in the local window w_k and U represents a 3×3 identity matrix.

In other embodiments, one or more of the filtering functions **1006**, **1110-1114** may each be implemented using a cross-bilateral filter. As a particular example, the filtering function **1106** may be used to generate output values in the GW channel **1108** as follows:

$$I_{G|W}^{CBF}(p) = \frac{1}{W(p)}\sum_{q \in w(p)} G_{\sigma_S}(\|p-q\|) G_{\sigma_R}(|I_W(p) - I_W(q)|) I_G(q) \tag{32}$$

Similar expressions may be used for the other filtering functions **1110-1114** that are implemented as cross-bilateral filters.

While the approach shown in FIG. **11** may use two three-channel guided filtering functions **1112** and **1114**, the use of three-channel guided filtering is not required. FIG. **12** illustrates a second example interband denoising function **216** in the image processing architecture **200** of FIG. **2** according to this disclosure. As shown in FIG. **12**, the interband denoising function **216** in this example receives the red, green, and blue channels of a blended RGB image frame **322** and passes the channels to three filtering functions **1202**, **1204**, and **1206**. In some cases, each of the filtering functions **1202**, **1204**, and **1206** may be implemented using a guided filter. However, each filtering function **1202**, **1204**, and **1206** may use any other suitable technique to filter image data.

In those embodiments using guided filters, the filtering function **1202** filters the green channel using itself as a guide map. The filtering functions **1204** and **1206** respectively filter the red and blue channels using a combination of (i) the red or blue channel and (ii) the filtered green channel that is output from the filtering function **1202**. In this example, a concatenation function **1208** can combine the red channel and the filtered green channel to generate the guide map for the filtering function **1204**, and a concatenation function **1210** can combine the blue channel and the filtered green channel to generate the guide map for the filtering function **1206**. In some cases, the outputs from the concatenation functions **1208** and **1210** may be expressed as follows:

$$I_R = \frac{q_G + p_R}{2} \tag{33}$$

$$I_B = \frac{q_G + p_B}{2} \tag{34}$$

here, q_G represents data values in the filtered green channel, and p_R and p_B respectively represent data values in the unfiltered red and blue channels. The results of the filtering include outputs **1212**, which represent denoised versions of the red, green, and blue channels. These outputs **1212** may

therefore represent the denoised RGB image frames provided to the interband sharpening function **218**.

When the filtering functions **1202**, **1204**, and **1206** are implemented using guided filters, each guided filter may operate in accordance with Equation (26) above. In some cases, a cost function can be minimized when using a guided filter as follow:

$$E(a_k, b_k) = \sum_{i \in \omega_k} \left((a_k I_i + b_k - p_i)^2 + \epsilon a_k^2 \right) \quad (35)$$

The solution to this problem may be expressed as follows:

$$a_k = \frac{\frac{1}{|\omega|} \sum_{i \in \omega_k} I_i p_i - \mu_k \overline{p}_k}{\sigma_k^2 + \epsilon} \quad (36)$$

$$b_k = \overline{p}_k - a_k \mu_k$$

In these embodiments, when a combination of the green channel and another channel is used as a guide map, the edges from both channels appear in the filtered results due to the edge-preserving property of the guided filter.

Note that the filtering function **1202** is described above as being implemented in some embodiments using a guided filter that filters the green channel using the green channel itself as a guide map. However, using a guided filter with self-guidance may provide weak noise reduction in some cases. While it is possible to improve smoothing by increasing the noise reduction strength of a guided filter with self-guidance, this comes with a tradeoff related to blurriness (meaning larger noise reduction strengths come with more blurriness). FIG. **13** illustrates a third example interband denoising function **216** in the image processing architecture **200** of FIG. **2** according to this disclosure. In this example, the filtering function **1202** has been replaced by a green-channel denoising function **1302**. The denoising function **1302** here ideally represents a denoising algorithm that can provide equivalent or better results relative to using a guided filter with self-guidance. Any suitable denoising algorithm may be used here to implement the denoising function **1302**. In some embodiments, the denoising function **1302** may implement any suitable technique disclosed in U.S. Pat. No. 10,097,765 (which is hereby incorporated by reference in its entirety) to reduce noise in image data.

In the example shown in FIG. **13**, the denoising function **1302** filters the green channel. The filtering functions **1204** and **1206** respectively filter the red and blue channels using a combination of (i) the red or blue channel and (ii) the filtered green channel that is output from the denoising function **1302**. Here, the outputs from the denoising function **1302** may be expressed as follows:

$$q_G = f(p_G) \quad (38)$$

The outputs from the concatenation functions **1208** and **1210** may have the same form as shown in Equations (33) and (34). However, since the outputs from the concatenation functions **1208** and **1210** use the filtered green channel's data, improving the quality of the filtered green channel using the denoising function **1302** also improves the quality of the guide maps that are generated by the concatenation functions **1208** and **1210** and used by the filtering functions **1204** and **1206**.

It should be noted that the functions shown in or described with respect to FIGS. **11** through **13** can be implemented in an electronic device **101**, server **106**, or other device in any suitable manner. For example, in some embodiments, at least some of the functions shown in or described with respect to FIGS. **11** through **13** can be implemented or supported using one or more software applications or other software instructions that are executed by the processor **120** of the electronic device **101**, server **106**, or other device. In other embodiments, at least some of the functions shown in or described with respect to FIGS. **11** through **13** can be implemented or supported using dedicated hardware components. In general, the functions shown in or described with respect to FIGS. **11** through **13** can be performed using any suitable hardware or any suitable combination of hardware and software/firmware instructions.

Although FIGS. **11** through **13** illustrate examples of an interband denoising function **216** in the image processing architecture **200** of FIG. **2**, various changes may be made to FIGS. **11** through **13**. For example, various functions shown in FIGS. **11** through **13** may be combined, further subdivided, replicated, omitted, or rearranged and additional functions may be added according to particular needs.

FIG. **14** illustrates an example interband sharpening function **218** in the image processing architecture **200** of FIG. **2** according to this disclosure. While the interband denoising function **216** allows for strong filtering of subsampled channels to remove strong noise and sampling, interpolation, and aliasing artifacts, this can also remove high-frequency content in these subsampled channels, which can create blur. The interband sharpening function **218** is therefore used to transfer details from one or more higher-SNR and higher-sampled color channels back into the red and blue channels.

As shown in FIG. **14**, the interband sharpening function **218** can receive various inputs, including the denoised RGB image frames generated by the interband denoising function **216** (represented by the denoised outputs **1120** or **1212**) and certain color channels generated by the warp and interpolation function **308** (represented by certain outputs **416**). A combining function **1402** subtracts the low-pass white channel information from the full white channel information generated by the warp and interpolation function **308** to produce a high-pass white (W_{HP}) channel **1404**. Similarly, a combining function **1406** subtracts the low-pass green channel information from the full green channel information generated by the warp and interpolation function **308** to produce a high-pass green (G_{HP}) channel **1408**. An averaging function **1410** combines the high-pass white channel **1404** with the high-pass green channel **1408** and averages the results, thereby producing a signal **1412** that represents the average high-frequency content contained in the white and green channels. Note, however, that if the white channel is omitted here, the combining function **1402** and the averaging function **1410** may be omitted, and the signal **1412** may represent the high-pass green channel **1408**.

A coring function **1414** generally operates to suppress noisy high-frequency components contained in the signal **1412**. For example, the coring function **1414** may implement

a filter that helps to remove the noisy high-frequency components contained in the signal **1412**. The coring function **1414** produces a signal **1416** that still predominantly identifies the high-frequency content of the white and green channels. As a particular example, the coring function **1414** may operate to produce results that are expressed as follows:

$$y = \begin{cases} 0, x < t_1 \\ x \cdot \left(\frac{(|x| - t_1)}{t_2 - t_1} + t_1 \right), t_1 \le x \le t_2 \\ x, x > t_2 \end{cases} \quad (39)$$

where x represents the input signal **1412** to the coring function **1414**, y represents the output signal **1416** from the coring function **1414**, and t_1 and t_2 represent tuning thresholds.

The red, green, and blue channels of the denoised RGB image frames (the outputs **1120** or **1212**) are provided to a local minimum function **1418**, which identifies one or more local minima within the red, green, and blue channels. The red, green, and blue channels of the denoised RGB image frames are also provided to a local maximum function **1420**, which identifies one or more local maxima within the red, green, and blue channels. Combining functions **1422** and **1424** can be used to combine the local minima and local maxima with the red, green, and blue channels, such as via subtraction. The resulting signals **1426** and **1428** are respectively provided to a maximum soft clipping function **1430** and a minimum soft clipping function **1432**.

The clipping functions **1430** and **1432** generally operate to modify the signal **1416** (which again predominantly identifies the high-frequency content of the white and green channels) in order to limit the amount of high-pass overshoot (bright halo) around strong edges in the image data. For example, the clipping function **1432** may limit the amount of high-pass overshoot around strong edges given a local bound xmax obtained from the local maximum function **1420** and an input signal x. In some embodiments, this can be expressed as follows:

$$y = \text{min_soft_clip}(x_{max}, x) = \begin{cases} x, x \le x_{max} \\ \max(0, x - x_{max})^{0.5} + x_{max}, x > x_{max} \end{cases} \quad (40)$$

where y represents the output signal **1428** from the clipping function **1432**. Similarly, the clipping function **1430** may limit the amount of high-pass overshoot around strong edges given a local bound x_{min} obtained from the local minimum function **1418** and an input signal x. In some embodiments, the operation of the clipping function **1430** may be defined as an inverse of the clipping function **1430**, which may be expressed as follows:

$$y = \text{max_soft_clip}(x_{min}, x) = -\text{min_soft_clip}(-x_{min} - x) \quad (41)$$

The operation of the clipping functions **1430** and **1432** results in the generation of a clipped signal **1434**, which may identify modified (clipped) high-frequency content of the white and green channels. The clipped signal **1434** and the red, green, and blue channels are provided to a combining function **1436**, which adds the clipped signal **1434** to the image data in the red, green, and blue channels. Essentially, this operates to add image details to the red and blue channels based on the high-frequency content of the green channel and/or the white channel without creating halo artifacts. This leads to the generation of outputs **1438**, which include sharpened red, green, and blue channels. These outputs **1438** may therefore represent the sharpened RGB image frames provided to the interband demosaic function **220**.

It should be noted that the functions shown in or described with respect to FIG. **14** can be implemented in an electronic device **101**, server **106**, or other device in any suitable manner. For example, in some embodiments, at least some of the functions shown in or described with respect to FIG. **14** can be implemented or supported using one or more software applications or other software instructions that are executed by the processor **120** of the electronic device **101**, server **106**, or other device. In other embodiments, at least some of the functions shown in or described with respect to FIG. **14** can be implemented or supported using dedicated hardware components. In general, the functions shown in or described with respect to FIG. **14** can be performed using any suitable hardware or any suitable combination of hardware and software/firmware instructions.

Although FIG. **14** illustrates one example of an interband sharpening function **218** in the image processing architecture **200** of FIG. **2**, various changes may be made to FIG. **14**. For example, various functions shown in FIG. **14** may be combined, further subdivided, replicated, omitted, or rearranged and additional functions may be added according to particular needs.

FIG. **15** illustrates an example interband demosaic function **220** in the image processing architecture **200** of FIG. **2** according to this disclosure. In this example, the interband demosaic function **220** generally operates to combine low-frequency information from the sharpened red and blue image data with high-frequency information from the sharpened green image data in order to enhance the sharpened red and blue image data. As described above, the interband demosaic function **220** is performed after image frames are blended, which allows the equalization of the high-frequency content to be done using blended image frames having less artifacts and noise.

As shown in FIG. **15**, the interband demosaic function **220** receives sharpened RGB image frames, such as the outputs **1438** representing the sharpened red, green, and blue channels of the sharpened RGB image frames. Low-pass filtering functions **1502** and **1504** are respectively used to filter the sharpened red channel and the sharpened blue channel, so the outputs of the low-pass filtering functions **1502** and **1504** generally represent low-pass red and low-pass blue filtered results (which are the low-frequency contents of the sharpened red and blue channels). High-pass filtering functions **1506** and **1508** are used to filter the sharpened green channel, so the outputs of the high-pass filtering functions **1506** and **1508** generally represent first and second high-pass green filtered results (which are the high-frequency contents of the sharpened green channel in different directions). More specifically, the high-pass filtering function **1506** is designed to filter image data in the horizontal direction, and the high-pass filtering function **1508** is designed to filter image data in the vertical direction.

The filtered green channel information is provided to a direction selection/combination function **1510**, which generally operates to either (i) select and output the filtered green channel information from one of the high-pass filtering functions **1506** and **1508** or (ii) select, combine, and output the filtered green channel information from both of the high-pass filtering functions **1506** and **1508**. For example, the outputs from the high-pass filtering functions **1506** and **1508** can be used as measures of edge energy along two directions (horizontal and vertical) in the sharpened

green channel. The direction selection/combination function **1510** can determine whether or not the edge energies in the sharpened green channel are predominantly aligned horizontally or vertically (or neither). In some cases, this can be accomplished by having the direction selection/combination function **1510** select the larger of the edge energies and determine whether the larger edge energy exceeds a specified threshold. If so, the output from the high-pass filtering function **1506** and **1508** associated with the larger edge energy can be provided from the direction selection/combination function **1510**. Otherwise, the direction selection/combination function **1510** can combine the outputs from both high-pass filtering function **1506** and **1508** and output the result.

Combining functions **1512** and **1514** respectively operate to combine the output from the direction selection/combination function **1510** with the sharpened red channel and the sharpened blue channel. For example, in some cases, the combining function **512** can add the output from the direction selection/combination function **1510** with the sharpened red channel, and the combining function **1514** can subtract the output from the direction selection/combination function **1510** with the sharpened blue channel. This results in the generation of outputs **1516**, which represent equalized sharpened red and blue channels. More specifically, the outputs **1516** include red and blue channels in which high-frequency content has been added from the sharpened green channel, which helps to equalize the high-frequency content across the three color channels. The sharpened green channel and the equalized sharpened red and blue channels may collectively form equalized sharpened RGB image frames, which may be provided to the tone-mapping function **222** and/or the other post-processing function(s) **224** for additional processing if desired.

It should be noted that the functions shown in or described with respect to FIG. **15** can be implemented in an electronic device **101**, server **106**, or other device in any suitable manner. For example, in some embodiments, at least some of the functions shown in or described with respect to FIG. **15** can be implemented or supported using one or more software applications or other software instructions that are executed by the processor **120** of the electronic device **101**, server **106**, or other device. In other embodiments, at least some of the functions shown in or described with respect to FIG. **15** can be implemented or supported using dedicated hardware components. In general, the functions shown in or described with respect to FIG. **15** can be performed using any suitable hardware or any suitable combination of hardware and software/firmware instructions.

Although FIG. **15** illustrates one example of an interband demosaic function **220** in the image processing architecture **200** of FIG. **2**, various changes may be made to FIG. **15**. For example, various functions shown in FIG. **15** may be combined, further subdivided, replicated, omitted, or rearranged and additional functions may be added according to particular needs.

FIGS. **16**A and **16**B illustrate example results that may be obtained using an image processing architecture that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure. More specifically, FIG. **16**A illustrates an example image **1600** generated using a conventional approach, and FIG. **16**B illustrates an example image **1602** generated using the image processing architecture **200**.

As can be seen in FIGS. **16**A and **16**B, the scene being captured by the images **1600** and **1602** includes a number of painted areas on a wall or other surface, where a large number of small dots and other painted features appear in the scene. The image **1600** shown here tends to be blurrier and has more difficulty capturing edges of the painted features cleanly. In contrast, the image **1602** shown here is much clearer and shows the edges of the painted features much more clearly. Among other reasons, this is because the image processing architecture **200** can perform intraband and interband demosaicing, interband denoising, and interband sharpening as described above.

Although FIGS. **16**A and **16**B illustrate one example of results that may be obtained using an image processing architecture that supports multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening, various changes may be made to FIGS. **16**A and **16**B. For example, the results shown here are merely meant to illustrate one example of the types of results that may be obtained using the approaches described in this patent document. The actual results obtained using the approaches described here can vary based on a number of factors, such as the scenes being imaged and how the functions described in this patent document are actually implemented in an electronic device **101**, server **106**, or other device.

FIG. **17** illustrates an example method **1700** for multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening according to this disclosure. For ease of explanation, the method **1700** is described as being performed by the electronic device **101** of FIG. **1** using the image processing architecture **200** of FIG. **2**. However, the method **1700** may be performed using any other suitable device in any other suitable system, such as when the method **1700** is performed by the server **106**.

As shown in FIG. **17**, multiple image frames capturing a scene are obtained at step **1702**. This may include, for example, the processor **120** obtaining multiple input image frames **202** using one or more imaging sensors **180**. In some cases, two or more of the input image frames **202** may have been captured using a common exposure. Also, in some cases, two or more of the input image frames **202** may have been captured using different exposures. A determination is made how to align the input image frames at step **1704**. This may include, for example, the processor **120** performing the alignment function **206** to select a reference image frame **302** and identify one or more non-reference image frames **304** from among the input image frames **202**. This may also include the processor **120** performing the alignment function **206** to generate one or more alignment maps **306**. Each alignment map **306** may identify how an image frame (such as a non-reference image frame **304**) can be warped to more closely align one or more of its features with one or more corresponding features of at least one other image frame (such as the reference image frame **302**).

A demosaic-warp operation is performed to warp one or more of the input image frames and to reconstruct image data of the input image frames in order to produce RGB input frames at step **1706**. This may include, for example, the processor **120** performing the demosaic-warp function **208** in order to perform intraband joint demosaicing and warping of the input image frames **202**. For instance, the processor **120** could use a kernel-adaptive approach or other approach to perform interpolations needed to fill in the red, green, and blue (and optionally white) data values in the color channels of the reference and non-reference image frames **302** and **304** in order to produce RGB input image frames **312** and **314**. The processor **120** could also use

bilateral interpolation filters or other filters **408-414** that can interpolate data values for the different color channels of the RGB input image frames **312** and **314**.

An equalization operation is performed to equalize the brightness of the RGB input image frames in order to produce equalized RGB input image frames at step **1708**. This may include, for example, the processor **120** performing the equalization function **210** to substantially equalize the brightness levels of the RGB input image frames **312** and **314** in order to produce equalized RGB input image frames. The equalized RGB input image frames are blended with one another in order to produce a blended RGB image frame at step **1710**. This may include, for example, the processor **120** performing the single-exposure blending function **212** to blend multiple equalized RGB input image frames associated with a common exposure (if any) and/or performing the multi-exposure blending function **214** to blend multiple equalized RGB input image frames or blended image frames associated with different exposures (if any) in order to produce a blended RGB image frame **322**.

An interband denoising operation is performed to reduce noise and artifacts in the blended RGB image frame in order to produce a denoised RGB image frame at step **1712**. This may include, for example, the processor **120** performing the interband denoising function **216** to reduce noise and sampling, interpolation, and aliasing artifacts in the red, green, and blue channels of the blended RGB image frame **322**. In some cases, this may be performed using guided filters for all color channels, such as when the green guided filter is self-guided or is guided using the white channel (as shown in FIG. **11**). In other cases, this may be performed using guided filters for the red and blue channels, which can be guided by the filtered green channel that is output from another guided filter (as shown in FIG. **12**) or from a denoising function (as shown in FIG. **13**). This may be done to produce a denoised RGB image frame (represented by the outputs **1120** or **1212**). An interband sharpening operation is performed to sharpen at least some of the color channels of the denoised RGB image frame at step **1714**. This may include, for example, the processor **120** performing the interband sharpening function **218** to add details from the denoised green channel to the denoised red and blue channels. This may be done to produce a sharpened RGB image frame (represented by the outputs **1438**).

An interband demosaic operation is performed to equalize high-frequency content in the color channels of the sharpened RGB image frame in order to produce an equalized sharpened RGB image frame at step **1716**. This may include, for example, the processor **120** performing the interband demosaic function **220** to restore high-frequency content from the sharpened green channel to the sharpened red and blue channels. This may be done to produce an equalized sharpened RGB image frame (represented by the denoised green channel and the outputs **1516** representing equalized sharpened red and blue channels).

One or more post-processing operations may be performed using the equalized sharpened RGB image frame to produce a final image of the scene at step **1718**. This may include, for example, the processor **120** performing the tone-mapping function **222** and/or one or more other post-processing functions **224** (such as an additional noise reduction operation and/or an edge sharpening operation) to produce a final image **204** of the scene.

Although FIG. **17** illustrates one example of a method **1700** for multi-frame blending with intraband and interband multi-frame demosaicing and with interband denoising and interband sharpening, various changes may be made to FIG. **17**. For example, while shown as a series of steps, various steps in FIG. **17** may overlap, occur in parallel, occur in a different order, or occur any number of times (including zero times). Also, as noted above, it is assumed here that both (i) combined intraband and interband multi-frame demosaicing and (ii) interband denoising and interband sharpening are being used together. However, the method **1700** may support one of these functionalities and not the other, so the method **1700** may omit steps **1706**/**1716** (and use another demosaicing technique) or omit steps **1712**/**1714** (and use other denoising/sharpening techniques).

FIG. **18** illustrates an example method **1800** for intraband demosaicing according to this disclosure. For ease of explanation, the method **1800** is described as being performed by the electronic device **101** of FIG. **1** using the image processing architecture **200** of FIG. **2**. However, the method **1800** may be performed using any other suitable device in any other suitable system, such as when the method **1800** is performed by the server **106**.

As shown in FIG. **18**, multiple input image frames are obtained at step **1802**. This may include, for example, the processor **120** providing a reference image frame **302** and one or more non-reference image frames **304** to the demosaic-warp function **208**. The processor **120** generally operates to perform a warp and interpolation function **308**, **310** for each of the image frames **302** and **304** in order to warp one or more of the image frames **302** and **304** and to perform interpolations used to reconstruct full-size color channels for the image frames **302** and **304**. In this example, a single-color channel image frame containing structure information associated with the scene being imaged is generated at step **1804**. This may include, for example, the processor **120** performing the W-guided image structure generation function **402** to generate a one-channel image showing the structural contents of the image frame **302**. One or more characteristics of the structure information associated with the scene being imaged are identified using the single-color channel image frame at step **1806**. This may include, for example, the processor **120** performing the gradient structure tensor function **404** to identify gradients in the single-color channel image frame and identify gradient strength, coherency, and orientation estimates for each pixel of the single-color channel image frame. One or more kernels are selected for use in filtering image data using the one or more characteristics at step **1808**. This may include, for example, the processor **120** performing the kernel selection function **406** to select one or more kernels **702** from a kernel bank **700** based on the gradient strength, coherency, and orientation estimates. The image frames are filtered using the selected kernel(s) at step **1810**. This may include, for example, the processor **120** using the selected kernel(s) **702** in the filters **408-414** of the warp and interpolation functions **308**, **310** to produce the outputs **416** (which include the reconstructed full-size color channels of the RGB input image frames **312**, **314**).

The RGB input image frames are converted to the YUV domain at step **1812**, and deghosting is performed to identify any motion area(s) in the captured scene and to generate one or more weight maps at step **1814**. This may include, for example, the processor **120** converting the RGB data of the RGB input image frames **312** and **314** into YUV data and providing the YUV data to the deghosting function **316**. This may also include the processor **120** performing the deghosting function **316** to identify any regions of the RGB input image frames **312** and **314** that differ from each other, such as by a threshold amount or percentage (which can be indicative of motion). The one or more weight maps are

provided for use in blending the RGB input image frames to produce a blended RGB image frame at step **1816**. This may include, for example, the processor **120** providing at least one weight map **318** to the blending function **320** (which in some cases may represent the blending functions **212** and **214**).

Although FIG. **18** illustrates one example of a method **1800** for intraband demosaicing, various changes may be made to FIG. **18**. For example, while shown as a series of steps, various steps in FIG. **18** may overlap, occur in parallel, occur in a different order, or occur any number of times (including zero times).

FIG. **19** illustrates an example method **1900** for interband denoising according to this disclosure. For ease of explanation, the method **1900** is described as being performed by the electronic device **101** of FIG. **1** using the image processing architecture **200** of FIG. **2**. However, the method **1900** may be performed using any other suitable device in any other suitable system, such as when the method **1900** is performed by the server **106**.

As shown in FIG. **19**, a blended RGB image frame is obtained at step **1902**. This may include, for example, the processor **120** providing a blended RGB image frame **322** to the interband denoising function **216**. The green channel of the blended RGB image frame is filtered to produce a denoised green channel at step **1904**, the red channel of the blended RGB image frame is filtered to produce a denoised red channel at step **1906**, and the blue channel of the blended RGB image frame is filtered to produce a denoised blue channel at step **1908**. In some cases, this may include the processor **120** using guided filters for all color channels. In other cases, this may include the processor **120** using guided filters for the red and blue channels, which can be guided by the filtered green channel from another guided filter or from a denoising function. Note, however, that any other suitable types of filters may be used here. The denoised red, green, and blue channels are provided as a denoised RGB image frame at step **1910**. This may include, for example, the processor **120** providing the outputs **1120** or **1212** representing the denoised RGB image frame to the interband sharpening function **218**.

Although FIG. **19** illustrates one example of a method **1900** for interband denoising, various changes may be made to FIG. **19**. For example, while shown as a series of steps, various steps in FIG. **19** may overlap, occur in parallel, occur in a different order, or occur any number of times (including zero times).

FIG. **20** illustrates an example method **2000** for interband sharpening according to this disclosure. For ease of explanation, the method **2000** is described as being performed by the electronic device **101** of FIG. **1** using the image processing architecture **200** of FIG. **2**. However, the method **2000** may be performed using any other suitable device in any other suitable system, such as when the method **2000** is performed by the server **106**.

As shown in FIG. **20**, a denoised RGB image frame is obtained at step **2002**. This may include, for example, the processor **120** providing a denoised RGB image frame generated by the interband denoising function **216** to the interband sharpening function **218**. Kernel-adaptive high-frequency content of image data in one or more higher-sampled color channels is identified at step **2004**. This may include, for example, the processor **120** performing the functions **1402**, **1406**, **1410** to generate a signal **1412** identifying the high-frequency content of the white and green channels (or just one of these channels) as output from the warp and interpolation function **308**, **310**. This may also include the processor **120** performing the coring function **1414** to suppress noisy components in the signal **1412**. One or more local maxima and one or more local minima are identified in the denoised red, green, and blue channels of the denoised RGB image frame at step **2006**. This may include, for example, the processor **120** performing the functions **1418** and **1420** to identify the one or more local maxima and one or more local minima.

The kernel-adaptive high-frequency content of the image data in the one or more higher-sampled color channels is clipped based on the one or more local maxima and the one or more local minima at step **2008**. This may include, for example, the processor **120** performing the functions **1422-1430** to limit the amount of high-pass overshoot around strong edges in the denoised red, green, and blue channels of the denoised RGB image frame. The clipped kernel-adaptive high-frequency content of the image data in the one or more higher-sampled color channels is combined with the denoised red, green, and blue channels of the denoised RGB image frame at step **2010**. This can help to reintroduce high-pass details into the denoised RGB image frame based on the low-pass green and/or low-pass white channel(s) in the outputs **416** (which can be generated using the adaptive kernel approach described above). The sharpened red, green, and blue channels are provided as a sharpened RGB image frame at step **2012**. This may include, for example, the processor **120** providing the outputs **1438** representing the sharpened RGB image frame to the interband demosaic function **220**.

Although FIG. **20** illustrates one example of a method **2000** for interband sharpening, various changes may be made to FIG. **20**. For example, while shown as a series of steps, various steps in FIG. **20** may overlap, occur in parallel, occur in a different order, or occur any number of times (including zero times).

FIG. **21** illustrates an example method **2100** for interband demosaicing according to this disclosure. For ease of explanation, the method **2100** is described as being performed by the electronic device **101** of FIG. **1** using the image processing architecture **200** of FIG. **2**. However, the method **2100** may be performed using any other suitable device in any other suitable system, such as when the method **2100** is performed by the server **106**.

As shown in FIG. **21**, a sharpened RGB image frame is obtained at step **2102**. This may include, for example, the processor **120** providing a sharpened RGB image frame generated by the interband sharpening function **218** to the interband demosaic function **220**. Low-pass filtering of the sharpened red and blue channels of the sharpened RGB image frame is performed at step **2104**, and high-pass filtering of the sharpened green channel of the sharpened RGB image frame is performed in multiple directions at step **2106**. This may include, for example, the processor **120** performing the functions **1502-1508** to perform low-pass filtering of the sharpened red and blue channels of the sharpened RGB image frame and to perform high-pass filtering of the sharpened green channel of the sharpened RGB image frame in the horizontal and vertical directions.

A determination is made if edge energies as represented by the high-pass filters' outputs indicate that the edges in the scene being imaged are aligned in a specified direction (horizontally or vertically) at step **2108**. This may include, for example, the processor **120** performing the direction selection/combination function **1510** to determine if one of the edge energies is larger than the other and if the larger edge energy exceeds a threshold. One or both of the high-pass filters' outputs are selected for combination with the

sharpened red and blue channels of the sharpened RGB image frame at step **2110**. This may include, for example, the processor **120** performing the direction selection/combination function **1510** to select (i) one of the high-pass filters' outputs if the edges in the scene are aligned in a specified direction or (ii) a combination of both high-pass filters' outputs if the edges in the scene are not aligned in a specified direction.

The outputs of the selected high-pass filter(s) are combined with the sharpened red and blue channels of the sharpened RGB image frame at step **2112**. This may include, for example, the processor **120** performing the functions **1512** and **1514** to combine the outputs of the selected high-pass filter(s) with the sharpened red and blue channels. As a particular example, the processor **120** may add the outputs of the selected high-pass filter(s) to the sharpened red channel to produce an equalized sharpened red channel and subtract the outputs of the selected high-pass filter(s) from the sharpened blue channel to produce an equalized sharpened blue channel. The sharpened green channel and the equalized sharpened red and blue channels are provided as an equalized sharpened RGB image frame at step **2114**. This may include, for example, the processor **120** providing the sharpened green channel and the outputs **1516** to the tone-mapping function **222** and/or the one or more other post-processing functions **224**.

Although FIG. **21** illustrates one example of a method **2100** for interband demosaicing, various changes may be made to FIG. **21**. For example, while shown as a series of steps, various steps in FIG. **21** may overlap, occur in parallel, occur in a different order, or occur any number of times (including zero times).

Note that the functionalities described above may find use in a number of image processing applications, such as various applications in which multiple image frames are blended. One example application noted above is a digital zoom use case where images are captured while a digital zoom feature is being used, in which case a set of Bayer image frames or other image frames can be blended with improved quality. Other example image processing applications that may use the functionalities described above may include low-light noise reduction (where noise created by low-light conditions can be reduced), "night mode" operation (where image frames of dark scenes are captured), and HDR image generation (where image frames of different exposures are blended). All of these applications and other image processing applications where multiple image frames are blended can benefit from multi-frame blending along with the functionalities described above. Also note that while described as being used to produce images of scenes, the same or similar approaches may be used to produce sequences of images, such as in a video stream.

Although this disclosure has been described with reference to various example embodiments, various changes and modifications may be suggested to one skilled in the art. It is intended that this disclosure encompass such changes and modifications as fall within the scope of the appended claims.

What is claimed is:

1. A method comprising:

obtaining multiple input image frames of a scene using at least one imaging sensor of an electronic device;

determining how to warp at least one of the input image frames in order to more closely align one or more features captured in the input image frames;

performing, using at least one processing device of the electronic device, an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp the at least one of the input image frames in order to produce red-green-blue (RGB) input image frames;

blending the RGB input image frames in order to produce a blended RGB image frame;

performing, using the at least one processing device of the electronic device, an interband denoising operation to remove at least one of noise and one or more artifacts from the blended RGB image frame in order to produce a denoised RGB image frame;

performing, using the at least one processing device of the electronic device, an interband sharpening operation to sharpen different color channels of the denoised RGB image frame in order to produce a sharpened RGB image frame;

performing, using the at least one processing device of the electronic device, an interband demosaic operation to substantially equalize high-frequency content in different color channels of the sharpened RGB image frame in order to produce an equalized sharpened RGB image frame; and

generating a final image of the scene based on the equalized sharpened RGB image frame.

2. The method of claim **1**, further comprising:

performing an equalization operation to substantially equalize brightness levels of the RGB input image frames prior to blending the RGB input image frames.

3. The method of claim **1**, wherein:

blending the RGB input image frames in order to produce the blended RGB image frame comprises:

performing a single-exposure blending operation to blend two or more image frames associated with a common exposure; and

performing a multi-exposure blending operation to blend two or more image frames associated with different exposures; and

at least one of the single-exposure blending operation and the multi-exposure blending operation uses at least one weight map determined using a deghosting operation.

4. The method of claim **1**, wherein generating the final image of the scene based on the equalized sharpened RGB image frame comprises at least one of:

performing a tone-mapping operation to increase a contrast of the equalized sharpened RGB image frame; and

performing one or more post-processing operations to at least one of apply final noise reduction and apply edge sharpening.

5. The method of claim **1**, wherein performing the intraband joint demosaic-warp operation comprises:

applying a warp and interpolation function to each of the input image frames in order to produce the RGB input image frames;

performing a deghosting operation to compare YUV versions of the RGB input image frames, identify one or more regions of the RGB input image frames associated with at least a threshold amount of motion in the scene, and generate one or more weight maps; and

providing the one or more weight maps for use during the blending of the RGB input image frames in order to limit or prevent blending of the RGB input image frames in the one or more regions of the RGB input image frames.

6. The method of claim 1, wherein:

performing the intraband joint demosaic-warp operation comprises:

generating a single-channel image frame that identifies structural content of a reference image frame among the input image frames;

determining one or more characteristics of the structural content in the single-channel image frame;

selecting one or more kernels based on the one or more characteristics; and

filtering the different color channels of the input image frames using multiple filters, the multiple filters using the one or more selected kernels; and

the different color channels of the input image frames are independently filtered using the multiple filters.

7. The method of claim 6, wherein:

determining the one or more characteristics of the structural content in the single-channel image frame comprises, for each pixel of the single-channel image frame:

identifying any gradients in multiple directions within a window around the pixel of the single-channel image frame; and

identifying gradient strength, coherence, and orientation estimates for the pixel of the single-channel image frame using any identified gradients within the window; and

selecting the one or more kernels based on the one or more characteristics comprises:

identifying an index into a bank of kernels using the gradient strength, coherence, and orientation estimates; and

selecting the one or more kernels from the bank of kernels based on the index.

8. The method of claim 1, wherein performing the interband demosaic operation comprises:

performing low-pass filtering of red and blue color channels of the sharpened RGB image frame in order to produce low-pass red filtered results and low-pass blue filtered results;

performing high-pass filtering of a green color channel of the sharpened RGB image frame in horizontal and vertical directions in order to produce first and second high-pass green filtered results;

selecting one or both of the first and second high-pass green filtered results; and

combining each of the low-pass red filtered results and the low-pass blue filtered results with the selected high-pass green filtered results.

9. The method of claim 1, wherein:

performing the interband denoising operation comprises performing filtering of red, green, and blue color channels of the blended RGB image frame to remove at least one of the noise and the one or more artifacts from the blended RGB image frame; and

the filtering of the red and blue color channels is based on image data of at least one of the green color channel and a white color channel of the blended RGB image frame.

10. The method of claim 1, wherein performing the interband sharpening operation comprises:

identifying high-frequency contents of at least one of a green channel and a white channel of one of the input image frames;

clipping the identified high-frequency contents based on one or more local maxima and one or more local minima in the different color channels of the denoised RGB image frame; and

combining the clipped high-frequency contents with the different color channels of the denoised RGB image frame in order to produce the sharpened RGB image frame.

11. An electronic device comprising:

at least one imaging sensor; and

at least one processing device configured to:

obtain multiple input image frames of a scene using the at least one imaging sensor;

determine how to warp at least one of the input image frames in order to more closely align one or more features captured in the input image frames;

perform an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp the at least one of the input image frames in order to produce red-green-blue (RGB) input image frames;

blend the RGB input image frames in order to produce a blended RGB image frame;

perform an interband denoising operation to remove at least one of noise and one or more artifacts from the blended RGB image frame in order to produce a denoised RGB image frame;

perform an interband sharpening operation to sharpen different color channels of the denoised RGB image frame in order to produce a sharpened RGB image frame;

perform an interband demosaic operation to substantially equalize high-frequency content in different color channels of the sharpened RGB image frame in order to produce an equalized sharpened RGB image frame; and

generate a final image of the scene based on the equalized sharpened RGB image frame.

12. The electronic device of claim 11, wherein the at least one processing device is further configured to perform an equalization operation to substantially equalize brightness levels of the RGB input image frames prior to blending the RGB input image frames.

13. The electronic device of claim 11, wherein:

to blend the RGB input image frames in order to produce the blended RGB image frame, the at least one processing device is configured to:

perform a single-exposure blending operation to blend two or more image frames associated with a common exposure; and

perform a multi-exposure blending operation to blend two or more image frames associated with different exposures; and

the at least one processing device is configured to use at least one weight map determined using a deghosting operation to perform at least one of the single-exposure blending operation and the multi-exposure blending operation.

14. The electronic device of claim 11, wherein, to generate the final image of the scene based on the equalized sharpened RGB image frame, the at least one processing device is configured to at least one of:

perform a tone-mapping operation to increase a contrast of the equalized sharpened RGB image frame; and

perform one or more post-processing operations to at least one of apply final noise reduction and apply edge sharpening.

15. The electronic device of claim 11, wherein, to perform the intraband joint demosaic-warp operation, the at least one processing device is configured to:

apply a warp and interpolation function to each of the input image frames in order to produce the RGB input image frames;

perform a deghosting operation to compare YUV versions of the RGB input image frames, identify one or more regions of the RGB input image frames associated with at least a threshold amount of motion in the scene, and generate one or more weight maps; and

provide the one or more weight maps for use during the blending of the RGB input image frames in order to limit or prevent blending of the RGB input image frames in the one or more regions of the RGB input image frames.

16. The electronic device of claim 11, wherein:

to perform the intraband joint demosaic-warp operation, the at least one processing device is configured to:

generate a single-channel image frame that identifies structural content of a reference image frame among the input image frames;

determine one or more characteristics of the structural content in the single-channel image frame;

select one or more kernels based on the one or more characteristics; and

filter the different color channels of the input image frames using multiple filters, the multiple filters using the one or more selected kernels; and

the at least one processing device is configured to filter the different color channels of the input image frames independently using the multiple filters.

17. The electronic device of claim 16, wherein:

to determine the one or more characteristics of the structural content in the single-channel image frame, the at least one processing device is configured, for each pixel of the single-channel image frame, to:

identify any gradients in multiple directions within a window around the pixel of the single-channel image frame; and

identify gradient strength, coherence, and orientation estimates for the pixel of the single-channel image frame using any identified gradients within the window; and

to select the one or more kernels based on the one or more characteristics, the at least one processing device is configured to:

identify an index into a bank of kernels using the gradient strength, coherence, and orientation estimates; and

select the one or more kernels from the bank of kernels based on the index.

18. The electronic device of claim 11, wherein, to perform the interband demosaic operation, the at least one processing device is configured to:

perform low-pass filtering of red and blue color channels of the sharpened RGB image frame in order to produce low-pass red filtered results and low-pass blue filtered results;

perform high-pass filtering of a green color channel of the sharpened RGB image frame in horizontal and vertical directions in order to produce first and second high-pass green filtered results;

select one or both of the first and second high-pass green filtered results; and

combine each of the low-pass red filtered results and the low-pass blue filtered results with the selected high-pass green filtered results.

19. The electronic device of claim 11, wherein:

to perform the interband denoising operation, the at least one processing device is configured to perform filtering of red, green, and blue color channels of the blended RGB image frame to remove at least one of the noise and the one or more artifacts from the blended RGB image frame; and

the at least one processing device is configured to filter the red and blue color channels based on image data of at least one of the green color channel and a white color channel of the blended RGB image frame.

20. The electronic device of claim 11, wherein, to perform the interband sharpening operation, the at least one processing device is configured to:

identify high-frequency contents of at least one of a green channel and a white channel of one of the input image frames;

clip the identified high-frequency contents based on one or more local maxima and one or more local minima in the different color channels of the denoised RGB image frame; and

combine the clipped high-frequency contents with the different color channels of the denoised RGB image frame in order to produce the sharpened RGB image frame.

21. A method comprising:

obtaining multiple input image frames of a scene;

performing, using at least one processing device of an electronic device, an intraband joint demosaic-warp operation to reconstruct image data in different color channels of the input image frames and to warp at least one of the input image frames in order to produce red-green-blue (RGB) input image frames; and

blending, using the at least one processing device, the RGB input image frames in order to produce a blended RGB image frame, wherein blending the RGB input image frames removes one or more aliasing artifacts created during the intraband joint demosaic-warp operation.

22. The method of claim 21, wherein performing the intraband joint demosaic-warp operation comprises:

applying a warp and interpolation function to each of the input image frames in order to produce the RGB input image frames;

performing a deghosting operation to compare YUV versions of the RGB input image frames, identify one or more regions of the RGB input image frames associated with at least a threshold amount of motion in the scene, and generate one or more weight maps; and

providing the one or more weight maps for use during the blending of the RGB input image frames in order to limit or prevent blending of the RGB input image frames in the one or more regions of the RGB input image frames.

23. The method of claim 21, wherein:

performing the intraband joint demosaic-warp operation comprises:

generating a single-channel image frame that identifies structural content of a reference image frame among the input image frames;

determining one or more characteristics of the structural content in the single-channel image frame;

selecting one or more kernels based on the one or more characteristics; and

filtering the different color channels of the input image frames using multiple filters, the multiple filters using the one or more selected kernels; and

the different color channels of the input image frames are independently filtered using the multiple filters.

24. The method of claim **23**, wherein:

determining the one or more characteristics of the structural content in the single-channel image frame comprises, for each pixel of the single-channel image frame:

identifying any gradients in multiple directions within a window around the pixel of the single-channel image frame; and

identifying gradient strength, coherence, and orientation estimates for the pixel of the single-channel image frame using any identified gradients within the window; and

selecting the one or more kernels based on the one or more characteristics comprises:

identifying an index into a bank of kernels using the gradient strength, coherence, and orientation estimates; and

selecting the one or more kernels from the bank of kernels based on the index.

25. The method of claim **23**, wherein generating the single-channel image frame comprises:

performing a frequency-based demosaic operation using the reference image frame in order to produce a multi-channel image frame;

applying a gamma correction with an initial linearity to the multi-channel image frame in order to produce a corrected multi-channel image frame;

converting red, green, and blue channels of the corrected multi-channel image frame into a luminance or luma (Y) domain in order to produce a Y channel;

applying bright equalization to a white channel of the corrected multi-channel image frame using the Y channel in order to produce an equalized white channel; and

filtering the Y channel using the equalized white channel in order to produce the single-channel image frame.

26. A method comprising:

obtaining a blended red-green-blue (RGB) image frame of a scene; and

performing, using at least one processing device of an electronic device, an interband demosaic operation to substantially equalize high-frequency content in red, green, and blue color channels of the blended RGB image frame in order to produce an equalized RGB image frame;

wherein the equalized RGB image frame comprises the green color channel of the blended RGB image frame and equalized red and blue color channels produced during the interband demosaic operation.

27. The method of claim **26**, wherein performing the interband demosaic operation comprises:

performing low-pass filtering of the red and blue color channels of the blended RGB image frame in order to produce low-pass red filtered results and low-pass blue filtered results;

performing high-pass filtering of the green color channel of the blended RGB image frame in horizontal and vertical directions in order to produce first and second high-pass green filtered results;

selecting one or both of the first and second high-pass green filtered results; and

combining each of the low-pass red filtered results and the low-pass blue filtered results with the selected high-pass green filtered results.

28. The method of claim **27**, wherein selecting one or both of the first and second high-pass green filtered results comprises:

determining whether edge energies represented by the first and second high-pass green filtered results are predominantly aligned horizontally or vertically;

in response to determining that the edge energies are predominantly aligned horizontally or vertically, selecting one of the first and second high-pass green filtered results associated with a horizontal or vertical direction for combination with each of the low-pass red filtered results and the low-pass blue filtered results; and

in response to determining that the edge energies are not predominantly aligned horizontally or vertically, combining the first and second high-pass green filtered results and outputting the combined high-pass green filtered results for combination with each of the low-pass red filtered results and the low-pass blue filtered results.

29. The method of claim **27**, wherein:

the selected high-pass green filtered results are added to the low-pass red filtered results; and

the selected high-pass green filtered results are subtracted from the low-pass blue filtered results.

30. The method of claim **26**, wherein the blended RGB image frame comprises an image frame generated using multiple input image frames that have been subjected to an intraband joint demosaic-warp operation.

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